# AN INTEGRATED DECISION SUPPORT SYSTEM FOR CLOUD COMPUTING TECHNOLOGY SERVICE PROVIDER SELECTION

(BULUT BİLİŞİM TEKNOLOJİ SERVİS SAĞLAYICISI SEÇİMİNDE ENTEGRE KARAR DESTEK SİSTEMİ)

by

# AYÇA MADEN, B.S.

### **Thesis**

Submitted in Partial Fulfillment
of the Requirements
for the Degree of

## MASTER OF SCIENCE

in

## LOGISTICS AND FINANCIAL MANAGEMENT

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## LIST OF SYMBOLS

AHP : Analytic Hierarchy Process

ANP : Analytic Network Process

MCDM : Multicriteria Decision Making

DEMATEL : Decision Making and Evaluation Laboratory

CSMIC : Cloud Service Measurement Index Consortium

TCO : Total Cost of Ownership

ITO : Information technology outsourcing

BPO : Business process outsourcing

SDO :Software development outsourcing

GRA : Grey Relational Analysis

SMI : Service Measurement Index

OS34CP : Outsourced Service Selection Strategy for Cloud Platform

C.A.RE :Complete-Auditable-Reportable

MADM : Multi-attribute decision-making

SelCSP : Select Cloud Service Provider

TAM : Technology Acceptance Model

GSD : Global Software Development

SLA : Service Level Agreement

TOPSIS : Technique for Order Performance by Similarity to Ideal Solution

TPA : Third Party Auditor

CSS : Cloud Storage Service

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#### **ABSTRACT**

Increasing competitive environment in businesses is shaping the way of Information Technology (IT) outsourcing. As a branch of IT, cloud computing technology is revolutionizing the IT industry in a promising way for delivering flexible and cheap computing resources via cloud platform. As a risky process of cloud computing technology service provider selection affects the existing capabilities of businesses and it must be well-organized. In literature, the evaluation of cloud computing technology especially systematically evaluated practices of cloud computing technology service provider selection remain limited. Service provider selection process requires a multicriteria approach including the evaluation of both quantitative and qualitative factors. User experience, which presents an important part of this process, also needed to be included with decision makers' judgments. Therefore, this thesis study develops an integrated fuzzy MCDM (Multi Criteria Decision Making) approach based on fuzzy DEMATEL (Decision Making Trial and Evaluation Laboratory), fuzzy ANP (Analytic Network Process) and fuzzy TOPSIS (Technique for Order Performance by Similarity to Ideal Solution). After reviewing the literature in detail, cloud computing technology service provider evaluation criteria are determined and analysed with the guidance of expert evaluations using fuzzy DEMATEL to identify key criteria that will be used in a case study. Secondly, in lights of expert evaluations, fuzzy DEMATEL and fuzzy ANP methods are applied to calculate weights of the evaluation criteria and the most suitable company of cloud computing technology service provider is chosen with fuzzy TOPSIS method.

**Keywords:** Cloud Computing Technology, Cloud Service Provider, Fuzzy DEMATEL, Fuzzy ANP, Fuzzy TOPSIS

# ÖZET

İşletmelerde giderek artan rekabet, bilgi teknolojilerinde dış kaynak kullanımı konusuna yeni bir boyut kazandırmıştır. Bilgi teknolojilerinin bir uzantısı olan bulut teknolojisi, bilgiye ucuz ve esnek erişim sağlayan ve bilgi teknolojisi endüstrisinde çığır açan bir teknolojidir. Bulut bilişim teknolojisi servis sağlayıcısı seçimi ise, düzgün planlanması gereken bir süreç olup şirketlerin mevcut kaynak kapasitelerini etkilemesi bakımından riskli bir yapıya sahiptir. Literatürde bulut bilişim teknolojisinin değerlendirildiği, özellikle de servis sağlayıcısı seçimi sürecinin sistematik olarak incelendiği çok az sayıda çalışma bulunmaktadır. Servis sağlayıcısı seçimi problemi nitel ve nicel faktörlerin birarada değerlendirilmesi gerektiği çok kriterli bir özelliktedir. Kullanıcı deneyimleri, bu değerlendirmenin önemli bir parçası olup, sözel ifadelerin seçim sürecine dahil edilmesi gerekmektedir. Bu sebeplerle bu çalışmada, bulut bilişim teknolojisinde en uygun servis sağlayıcısını seçebilmek için bulanık DEMATEL, bulanık ANP ve bulanık TOPSIS metotlarının dahil edildiği entegre bir çok kriterli karar verme metodolojisi geliştirilmiştir. Önerilen metodoloji, bir vaka analizi kapsamında uygulanarak geçerliliği test edilmiştir. İlk aşamada, detaylı yazın taramasıyla belirlenen bulut bilişim teknolojisi servis sağlayıcısı seçiminde kullanılacak değerlendirme kriterleri uzman görüşleri alınarak bulanık DEMATEL yöntemi ile analiz edilmiş ve vaka analizinde temel alınacak anahtar değerlendirme kriterleri belirlenmiştir. İkinci aşamada ise, uzman görüşleri ile bulanık DEMATEL ve bulanık ANP metodları uygulanarak değerlendirme kriterlerinin önem dereceleri hesaplanmış ve bulanık TOPSIS metodu kullanılarak en uygun servis sağlayıcı firma seçilmiştir.

**Anahtar Kelimeler:** Bulut Teknolojisi, Bulut Teknolojisi Servis Sağlayıcısı, Bulanık DEMATEL, Bulanık ANP, Bulanık TOPSIS

#### 1. INTRODUCTION

The roots of clouds computing can be tracked by observing the advancement of several technologies, especially in hardware (virtualization, multi-core chips), Internet technologies (Web services, service-oriented architectures, Web 2.0), distributed computing (clusters, grids), and systems management (autonomic computing, data center automation) (Buyya et al., 2011). Cloud Computing has the potential to transform a large part of the IT industry and makes software even more attractive as a service and shapes the way of designed and purchased IT hardware (Armabrust et al., 2009). Therefore, the traditional concept of IT outsourcing is replaced by the idea of outsourcing only value added functions as offered by cloud service providers. Cloud computing technology aims to deliver a network of virtual services so that users can access them from anywhere in the world on subscription at competitive costs. It also offers significant benefits to the businesses and communities by freeing them from the low-level task of setting up Information Technology infrastructure and thus creating business value for their services (Garg et al. 2012). SMEs had to make high capital investment upfront for procuring IT infrastructure, skilled developers and system administrators, which results in a high cost of ownership. IT organisations need to look at the consumer trends. The possibility for innovation that cloud computing technology offers is critical for businesses. Therefore, service perspective allows to think about what they need without thinking about whether their IT function have the necessary skills, hardware or resources. In view of this, enriching the available computing resources of cloud platform is needed.

Cloud service providers should clarify their position to offer appropriate services which can affect customers' confidence for increasing their understanding of the cloud service adoption process. Each cloud provider offers similar services at different performance levels, therefore given this diversity of cloud service offerings, an important challenge is to discover who are the "right" cloud providers to meet their requirements. The candidate cloud computing technology services on the Internet are usually of diverse sources which cause a big challenge for businesses. In view of this challenge, we provided a framework as an outsourcing strategy in cloud platforms to help customers.

To enhance objective provider selection and determine users' preferences, we need to quantify subjective opinions automatically and precisely.

Although many researchers analyse this cloud computing technology service provider selection strategy, current practice remains limited about which cloud provider should be chosen and how to compare the candidates of several cloud computing service provider. The main issue in a cloud service selection process concerns the comparison of several service candidates by evaluating and aggregating multiple criteria, and the measurement of qualitative service attributes (Sun et al. 2014). The existing cloud service selection approaches are generally Multi Criteria Decision Making (MCDM) based, optimization based and logic based approaches for cloud service selection such as MCDM-Analytic Hierarchy Process (Godse & Mulik, 2009), Optimization (Martens & Teuteberg, 2012), Optimization-greedy (Jung et al. 2013), Logic-description logic (Kanagasabai, 2012). Based on the recent literature survey of Sun et al. (2014), three main points identified as open issues on contemporary cloud service selection approach; the lack of consideration of the interdependency of criteria, the lack of an advanced multi-criteria-based measurement of user preferences, and the lack of an efficient means to deal with qualitative parameters and fuzzy expression. Open issues on cloud service selection process can be identified for cloud service provider selection approach on which also has limited study. To determine these research gaps, an integrated fuzzy MCDM approach was proposed for a decision support system including fuzzy DEMATEL method for the interdependency of criteria, and fuzzy ANP method for qualitative parameters applying also fuzzy TOPSIS method.

In cloud service outsourcing, MCDM and handling fuzzy information are crucial for determining most suitable service provider. In view of this, a wide range of fuzzy information must be accomplished to achieve the best tradeoff between computational complexity and decision accuracy. The traditional approaches disregard some new trends in MCDM area and actual problems can be solved with this new concept using integrated MCDM methods. A new criteria could be added or deleted from our proposed framework, on the basis of practical requirement. Therefore, analyzing the structural model of fuzzy DEMATEL method, we firstly figured out which criteria are

of more fundamental importance for the system, and which are not. In this thesis study we propose an integrated fuzzy MCDM framework for cloud technology service selection in three components; fuzzy DEMATEL to determine effect and cause criteria, and to reveal the relationships among criteria and dimensions and prioritize the criteria based on the type of relationships and severity of their effects on each criteria; fuzzy DEMATEL and fuzzy ANP for identifying criteria weights based on vague expressions and selecting the most effective alternative applying fuzzy TOPSIS method. It is also quite clear that few studies focused the integrated MCDM model using fuzzy DEMATEL, fuzzy ANP and fuzzy TOPSIS on the selection of cloud computing technology service provider. For proving the applicability and creditability of the proposed methodology, our framework is validated by the case study based on real data obtained from case company Hipo to provide accurate, reliable prediction. Our proposed integrated MCDM approach not only ranked and selected an alternative, but also improved strategies to determine order of priorities to represent an important insight for decision-makers for selection process which is driven by numerous factors from cost to the vendor related.

The rest of this study is structured as follows: cloud computing technology service outsourcing is briefly reviewed in Section II. Section III presents a proposition of an integrated DEMATEL-ANP and TOPSIS methods in fuzzy environment for the cloud computing technology service provider selection framework and determines the cloud service provider evaluation criteria. Section IV includes the illustration of the proposed presents evaluation framework through a case study. Section V gives the concluding remarks with future directions.

# 2. CLOUD COMPUTING TECHNOLOGY SERVICE OUTSOURCING 2.1 CLOUD COMPUTING TECHNOLOGY

National Institute of Standards and Technology, Information Technology Laboratory defines cloud computing technology as a model for enabling ubiquitous, convenient, ondemand network access to a shared pool of configurable computing resources (e.g., networks, servers, storage, applications, and services) that can be rapidly provisioned and released with minimal management effort or service provider interaction (Mell & Grance, 2011).

The synergistic aim of cloud computing technology model is to provide on-demand resources in order to achieve higher throughput and be able to tackle large-scale computational problems (Rimal & Choi, 2012). While doing our jobs, we expect to access the information from everywhere we need. In view of this, cloud system delivers Internet-based technology in real time as an issue of both technology and economy. The cloud computing technology platform provides a flexible way in pay as you go manner for management and delivery of resources on Internet and it changes the financial model of the company and it enables us to focus on transforming our businesses. Cloud computing technology allows the forward thinking although moving to the cloud seems disruptive to the existing IT function. It provides more detailed provisioning and planning systems, and helps the enterprise to manage its own service level requirements by building redundancy into its cloud provisioning. Cloud also allows novel disaster recovery solutions that determine many of the pressing concerns of IT professionals.

Alshamaila & Papagiannidis (2013) focused on the empirically examined studies that need to be extant when considering the decision making processes on the adoption of cloud computing technology. In relevant study, cloud computing technology is described as a style of computing where massively scalable IT-related capabilities are provided as a service using Internet technologies to multiple external customers.

As a radical innovation in technology, cloud computing technology offers organisations a chance to improve their processes with free IT staff time to have a business and strategy focus and allow a much easier relationship with suppliers of services. Cloud

computing is changing the future of businessas as a novel field in a broad sense, a part of distributed computing. It is a service, providing computing and software applications as well as data storage that can be easily accessed (Su et. al. 2012). The distinctive features of cloud computing technology would also offer third parties to be directly integrated with accountants, suppliers, regulators and allow them having opportunities with the flexibility that new technology provide. Today, companies prefer using the clouds for faster and reliable Internet. The internal roles have to be faster acting than before when we deploy cloud computing technology. With cloud computing technology, fast tracking gives you a robust system that makes assessments and changes really quickly.

The vulnerabilities of cloud computing technology platform must be critically examined which affects businesses trading on the internet before choosing an appropriate cloud service provider (Aleem & Sprott, 2013). There are many attributes that cloud computing technology has which should support its rapid diffusion and adoption on the technological basis. For example, the implementation of cloud computing technology is very important for large organisation with a large legacy of IT investments, infrastructure and outsourcing contracts. To determine the speed of implementation, exploitation and reinvention; cultural, structural and political legacies are also exist.

In the kind of commercial sector, people have started to think about how can they leverage these models within their business or how they can actually terminate existing models to be able to deliver these kind of levels of services internally and how they can drive costs out of their business and use these services. Additionally, particular studies prove that if a firm's business processes satisfy its needs, it is likely less favorable to adopt cloud computing technology. Conversely, the firms that need higher levels of application functionality may be eager to adopt cloud computing technology.

### 2.1.1 CLOUD COMPUTING TECHNOLOGY SERVICES

The definition of cloud computing technology describes it as clusters of distributed computers (largely vast data centers and server farms) which provide on-demand resources and services over a networked medium (usually the Internet) seems to be commonly accepted (Sultan, 2011). Cloud offers enormous benefits to businesses such

as reduced costs, since they no longer need to spend large amounts of capital on buying expensive application software or sophisticated hardware that they might never need (Park & Jeong, 2012).

The services that can be offered by cloud computing technology can be listed in the following three main areas (Sultan, 2011),

- <u>Infrastructure as a Service (IaaS)</u>: Products offered via this mode include the remote delivery (through the Internet) of a full computer infrastructure (e.g., virtual computers, servers, storage devices, etc.). The most notable vendors under this category are Amazon's EC2, GoGrid's Cloud Servers, and Joyent
- <u>Platform as a Service (PaaS)</u>: Services provided by the traditional computing model which involved teams of network, database, and system management experts to keep everything up and running (e.g., operating systems, databases, middleware, Web servers and other software) are now provided remotely by cloud computing technology providers under this layer. Among the early market leaders in this area are Google's App Engine, Microsoft's Azure, Amazon Web services, and Force.com.
- <u>Software as a Service (SaaS)</u>: Under this layer applications are delivered through the medium of the Internet as a service. Instead of installing and maintaining software, one can simply Access it via the Internet; thus freeing oneself from complex software and hardware management. This type of cloud computing technology service offers a complete application functionality that ranges from productivity applications (e.g. word processing, spreadsheets, etc.) to programs such as those for Customer Relationship Management (CRM) or Enterprise-Resource Management (ERM). For example, products under this category include Yahoo mail, Google Apps, Saleforec.com, WebEx and Microsoft Office Live.

National Institute of Standards and Technology explains four deployment models of cloud computing technology (Mell & Grance, 2011). In view of this, private cloud infrastructure is provisioned for exclusive use by a single organization comprising multiple consumers (e.g., business units). It may be owned, managed, and operated by the organization, a third party, or some combination of them, and it may exist on or off premises, while community cloud infrastructure is provisioned for exclusive use by a specific community of consumers from organizations that have shared concerns (e.g.,

mission, security requirements, policy, and compliance considerations). It may be owned, managed, and operated by one or more of the organizations in the community, a third party, or some combination of them, and it may exist on or off premises. Public cloud infrastructure is provisioned for open use by the general public. It may be owned, managed, and operated by a business, academic, or government organization, or some combination of them. It exists on the premises of the cloud provider whereas hybrid cloud infrastructure is a composition of two or more distinct cloud infrastructures (private, community, or public) that remain unique entities, but are bound together by standardized or proprietary technology that enables data and application portability (e.g., cloud bursting for load balancing between clouds). Cloud computing benefits is shown in Figure 2.1,

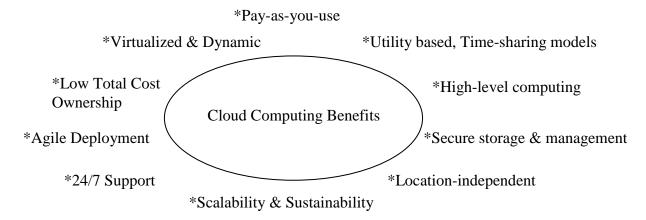


Figure 2.1. Cloud computing benefits

The main characteristics of cloud computing technology which help the development and adoption of this technology are service oriented, loose coupling, strong fault tolerant, business model and ease use (Gong et al. 2010). These characteristics of this area are proposed to understand the essentials of cloud computing technology. As service oriented conceptional characteristic, the details of inner implementations are determined. National Institute of Standards and Technology, Information Technology Laboratory defines the essential characteristics of cloud computing technology as ondemand self-service, broad network access, resource pooling, rapid elasticity and measured service. On-demand self service related with provisioning computing capabilities, such as server time and network storage without requiring human

interaction with each service provider. Broad network access is the availability of capabilities over the network and accessed through standard mechanisms that promote use by heterogeneous thin or thick client platforms (e.g., mobile phones, tablets, laptops, and workstations). To serve multiple consumers, the provider's computing resources are pooled and examples of resources include storage, processing, memory, and network bandwidth. Rapid elasticity stands for the Capabilities that can be elastically provisioned and released, in some cases automatically, to scale rapidly outward and inward commensurate with demand.

### 2.1.2 WHY CLOUD COMPUTING TECHNOLOGY SERVICE OUTSOURCING?

The initiation point for cloud computing technology ideas started with outsourcing issues. The main problem of cloud service outsourcing process is to find an appropriate service provider. From the outsourcing domain, checking the different models, deciding the right criteria and choosing the right service provider are crucial for the design of cloud service contracts to create a healthy environment for cloud adoption.

The general areas of outsourcing used within IT management literature can be identified as Business process outsourcing (BPO), Information Technology Outsourcing (ITO) and Software development outsourcing (SDO) (Sebesta, 2013). BPO is more familier within large organisations, while ITO could be determined as the most enticing area for contemporary SMEs by cloud computing technologies.

ITO is quite popular area of outsourcing which is closely connected with the SaaS and cloud computing technology trends. ITO means to short, medium and long-term outsourcing and is a method of purchasing IT services for the management of IT infrastructure and business applications and it addresses total and partial outsourcing and insourcing in combination with geographical location layers like domestic near-shore and offshore, within the frame of a service vendor constellation (Bensch et. al. 2014). ICT (Information and Communication Technologies) services can be rapidly delivered to its customers by cloud computing technology as a recent emergence of new

technologies. Characteristics of cloud computing and IT outsourcing is shown in Table 2.1,

Table 2.1 Characteristics of Cloud Computing and IT Outsourcing (based on Martens & Teuteberg, 2012)

| Characteristic                          | IT outsourcing   | <b>Cloud Computing</b>   |
|---|--|--|
| Negotiation                             | User company can<br>negotiate pricing models,<br>payment structures and<br>SLAs completely.                                  | Standardized SLAs with little possibilities for negotiation and customization solely offered by large providers. |
| Location of the Servers<br>(Hardware)   | Servers are located in-house or in the data center of the provider   | Hardware resources are solely located in third-party data centers  |
| Architecture and Resource<br>Management | One physical server is identified for one particular client  | To realize economies of scale Multi-tenant architecture is determined  |
| Pricing Model                           | Licensing fee or pricing<br>scheme like consulting<br>services (low pricing<br>transparency); resources are<br>not divisible | Price discrimination is<br>detailed on an usage-depend<br>basis (e. g. per gigabyte or<br>to-the-minute billing) |
| Degree of Automation                    | Provides Low Degree of<br>Automation: manual scaling<br>of required resources  | Provides High Degree of<br>Automation: automatic<br>scaling of required resources                                |
| Standardization of IT<br>Services       | Assures individual development, implementation and/or management of IT services  | Assures highly substitutable and standardized Cloud Computing services   |
| Legal Responsibility                    | Data protection and the legal effects are in the responsibilities of the user company  |  |

As an activity in cloud computing technology, outsourcing provides more value than organizations' own IT department,. Therefore, the outsourcing organizations benefits from economies of scale and is able to develop core competencies in areas of IT that would be difficult for a company that is in a different industry and has other core competencies (Bayrak, 2013).

To improve the performance of IT outsourcing engagement, working together of the contractual provisions and commitment must be well understood in order to enhance the design and management of contracts (Goo et. al. 2008). The authors found three sets of theoretically distinct SLA (Service Level Agreement) characteristics as foundation, change, and governance characteristics, reflecting common underlying themes of management control often used by firms to manage outsourcing relationships. Gantman (2011) focused on a multidimensional set of characteristics, as diverse as an organization's business model and size, industry specifics, organizational culture and external environment, were found to play a role in IT outsourcing decisions.

When managing an outsourcing project, selection of an effective provider is a critical issue and it must be determined as a long and complicated process. In this thesis study, we focused on this important provider selection topic with a proposed framework to choose an optimum cloud computing technology service provider.

### 2.1.3 LITERATURE SURVEY FOR CLOUD COMPUTING TECHNOLOGY

When evaluating cloud computing technology services, a set of suitable measurement criteria or metrics must be chosen, according to the rich research in the evaluation of traditional computer systems, the selection of metrics plays an essential role in evaluation implementations (O'Brien et al. 2012).

A comprehensive service evaluation method is brought forth for the cloud service selection by two key functions dependence functions between different QoS criteria, and satisfaction functions associated with various criteria (Dou et al. 2013). Sebesta & Vorisek (2010) proposed a view on management and outsourcing of ICT services. Economic viability and flexibility were important for using cloud computing technology by a UK-based SME (Sultan, 2011). Response time can be used as a good parameter in a service level agreement. But for small, large, and extra large instances it is important to improve the stability of response time before signing any agreement between cloud provider and user (Alhamad et al. 2010).

Park & Jeong (2012) aim to find the most suitable SaaS ERPs according to their correlation with the criteria and to recommend a SaaS ERP package which best suits users' needs. For QoS (Quality of Service) attributes in the SMI, Garg & Versteeg (2012) offered comparative evaluation of cloud services in SMI by cloud service Measurement Index Consortium-CSMIC defining all key performance metrics applying AHP in cloud computing technology. While the outsourced resources are usually of diverse sources, various service quality levels, and different structures bring a big challenge for the selection of outsourced resources (Ni et al., 2012). In view of this challenge, a selection strategy, named *OS34CP* (Outsourced Service Selection Strategy for Cloud Platform, *OS34CP*), is provided to help the service outsourcing process, in cloud platform.

A set of measurement criteria must be chosen when evaluating cloud services. A comprehensive investigation into evaluation metrics in the cloud computing technology focused on the several research gaps for evaluating elasticity and security of commercial cloud services (Li et al., 2013). They also recommended employing a suite of mixed types of benchmarks to evaluate cloud services in the future. Grubisic (2013) investigated the market readiness to adopt the cloud as the future ERP platform, using AHP methodology. The results demonstrate a concern for data privacy and availability. An original research survey helps to choose an appropriate cloud service provider with 200 IT professionals working in public and private sectors (Aleem & Sprott, 2013).

The security concerns are well founded in a cloud environment due to increasing organized cyber crime activities. Walterbusch et al. (2013) present a TCO approach for cloud computing technology services. Cloud computing technology enables rapid delivery of ICT services to its customers to its customers (Sebesta, 2013), and covers the 'Metrics for Application Service Variants Comparison' for ICT service architecture separating a special category of metrics for future extent of outsourcing. M. Sebesta identified connection between the extent of outsourcing and outsourcing success when compared different success rates. This approach is reasonable thanks to technological progress and changes in business environment (Sebesta, 2013). Ergu & Peng (2014) propose a framework for SaaS software packages evaluation and selection by

combining the virtual team concept with the BOCR model of ANP taking feedbacks into consideration for SMEs. From a systematic and practical perspective; Ren et al. (2013), presents a study for cloud manufacturing as well as a cloud-to-ground solution. Cloud manufacturing customers can have access to on-demand services, such as engineering design, simulation, production, assembling, testing and management.

When assessing cloud computing technology services, the authors portrayed a set of suitable measurement criteria or metrics. As such, every single evaluation study inevitably mentions particular metrics when reporting the evaluation process and/or result. Dou et al. (2013), believe that the category and capacity of a services engaged in cloud platform are limited compared to the nearly unlimited Web resources on Internet, so an outsourcing scenario is introduced for developing an elastic cloud platform through making a tradeoff between the unlimited Web resources and the limited services held by a business cloud platform. Sultan (2011) presented a case study of a cloud experience by a British SME in order to further highlight the perceived values of cloud computing technology in terms of cost and efficiency for real small enterprises. Sebesta (2010), introduces a comprehensive methodology, together with important criteria to be considered for a much suited ICT service provisioning practice.

Benlian & Hess (2011) analyzed as a first study the opportunities and risks associated with adopting SaaS as perceived by IT executives at adopter and non-adopter firms and analyzed the data collected through a survey of 349 IT executives at German companies. Their findings suggest that in respect to both SaaS adopters and non-adopters, security threats are the dominant factor influencing IT executives' overall risk perceptions.

Garg et al. (2012) propose a framework and a mechanism that measure the quality and prioritize cloud services. Such a framework can make a significant impact and will create healthy competition among cloud providers to satisfy their SLA and improve their QoS, they have also shown the applicability of the ranking framework using a case study. Considering that the selection of metrics plays an essential role in evaluation implementations, Li et al. (2013) performed a comprehensive investigation into

evaluation metrics in the cloud computing technology domain based on this SLR. To the best of their knowledge, this is the only metrics-intensive study of cloud services evaluation (Li et al. 2013). Walterbusch et al. (2013) present a TCO approach for cloud computing technology services, it was found that decision processes in cloud computing technology are conducted ad hoc and lack systematic methods and the presented method raises the awareness of indirect and hidden costs in cloud computing technology. Ouedraogo & Mouratidis (2013) proposes a well-defined approach, known as the Complete-Auditable-Reportable or C.A.RE, as a way to minimize one's exposure to the insecurity we live within the cloud, they also summaries some security threats to cloud services with the description specific for cloud computing technology.

Both a partial- and full IT outsourcing approach discussed in a systematic classification to give an overview concerning ITO efforts in information systems research (Bensch et al. 2014). According to the authors, there is a lack of procedural approaches in the IT outsourcing. A framework SelCSP (Select Cloud Service Provider) facilitates selection of trustworthy and competent service provider. Trustworthiness is computed from personal experiences gained through direct interactions or from feedbacks related to reputations of vendors while competence is assessed based on transparency in provider's SLA (Ghosh et al. 2014). Cloud computing technology literature survey is shown in Table 2.2.

Table 2.2.a. Cloud Computing Technology Literature Survey

| Authors                   | Objective of the Study  |  | Case<br>Study/Illustrative<br>Example |
|---------------------------|---|--|---------------------------------------|
| Aleem & Sprott (2013)     | The paper aims to examine the appropriateness of the cloud computing and to identify security concerns for businesses to deploy one of the cloud platforms.  Original Research Survey |  | Illustrative Example                  |
| Alshamaila et. al. (2012) | The paper aims to contribute a research on cloud computing, by studying the (SME) adoption process.   | Interviewing   | Illustrative Example                  |
| Akioka & Muraoka (2010)   | The paper aims to verify usability of Amazon Elastic Computing Cloud (Amazon EC2) from the view of both value as a research tool, and cost performance.  Benchmarking                 |  | Case Study                            |
| Benlian & Hess (2011)     | The paper aims to analyze the opportunities and risks associated with adopting SaaS as perceived by IT executives at adopter and non-adopter firms.                                   |  | Case Study                            |
| Bensch et. al.(2014)      | The paper aims to give an overview concerning ITO efforts in information systems research.  |  | Illustrative Example                  |
| Cao (2012)                | The paper aims to propose a two-stage vendor selection framework for IT outsourcing in microfinance banks.  | MCDM-ANP, Social choice function, Gray relational analysis | Case Study                            |
| Casas & Schatz (2014)     | The paper aims to provide a ground truth basis for developing future Cloud services with QoE requirements.  | Lab Experiments,<br>Field Trials                           | Case Study                            |

Table 2.2.b Cloud Computing Technology Literature Survey

| Authors                | Objective of the Study  | Method                          | Case<br>Study/Illustrative<br>Example |
|------------------------|---|---------------------------------|---------------------------------------|
| DaSilva et. al. (2013) | The paper aims to examine how Amazon.com, Salesforce.com and Siebel responded to the disruptive power of the cloud computing technology.  | Research Study                  | Illustrative<br>Example               |
| Dou et. al. (2013)     | The paper aims to investigate the service requirements of the business cloud platform.  | Feasibility Study of the Method | Case Study                            |
| Feng et. al. (2014)    | The paper aims to question: When multiple IaaS providers face a common pool of potential users, how should each one of them choose the optimal price that maximizes its own profit? | Game<br>Theoretic Technique     | Illustrative<br>Example               |
| Godse & Mulik (2009)   | The paper aims to present an approach to select an appropriate SaaS product for enterprises.  | MCDM-AHP                        | Case Study                            |
| Gong et. al. (2010)    | The paper aims to summarize general characteristics of cloud computing.   | Research Study                  | Illustrative<br>Example               |
| Grubisic (2013)        | The paper aims to investigate the market readiness to adopt the Cloud.  | Interviewing,<br>Questionnaire  | Case Study                            |
| Helvacioglu (2010)     | The paper aims to provide an analysis of cloud computing in Turkey by exploring the players and the domestic patterns of cloud system.  | Research Study                  | Illustrative<br>Example               |

Table 2.2.c Cloud Computing Technology Literature Survey

| Authors              | Objective of the Study   | Method  | Case<br>Study/Illustrative<br>Example |
|----------------------|--|---|---------------------------------------|
| Hsua et. al. (2013)  | The paper aims to improve the overall performance of suppliers in terms of carbon management.  MCDM-DEMATEL  |   | Case Study                            |
| Jula et. al. (2014)  | The paper aims to investigate all of the credible and effective studies that have examined Cloud Computing Service Composition (CCSC).  Systematic Literature Review |   | Illustrative<br>Example               |
| Lenk et. al. (2011)  | The paper aims to measure the performance of virtual machines in IaaS offerings.   | Benchmarking  | Case Study                            |
| Li et. al. (2012)    | The paper aims to standardize the details of performance evaluation of commercial Cloud services.  | Taxonomy  | Illustrative<br>Example               |
| Losup et. al. (2011) | The paper aims to analyse the performance of clouds for Many Tasks Computing-based scientific computing.   | Traditional System<br>Benchmarking, Trace<br>Based Simulation | Case Study                            |
| Mell & Grance (2011) | The paper aims to serve broad comparisons of cloud services and deployment strategies.   | Research Study  | Illustrative<br>Example               |

Table 2.2.d Cloud Computing Technology Literature Survey

| Authors                   | Objective of the Study  | Method  | Case<br>Study/Illustrative<br>Example |
|---------------------------|---|---|---------------------------------------|
| Mohammad & Mcheick (2011) | The paper aims to shed light on software testing in Cloud system development and testing.   | Research Work   | Illustrative Example                  |
| Park & Jeong (2012)       | The paper aims to find the most suitable SaaS ERPs recommending a SaaS ERP package which best suits users' needs.                                     | Quality Network<br>Model  | Case Study                            |
| Ren et. al. (2013)        | The paper aims to present a new perspective for cloud manufacturing, as well as a cloud-to-ground solution.   | Systematic and<br>Practical Perspective,<br>Cloud Platform<br>Prototype | Illustrative Example                  |
| Sangjae et. al. (2013)    | The paper aims to evaluate Saas via four measures: learning and growth, internal business processes, customer performance, and financial performance. | Balanced Scorecard,<br>Interview  | Case Study                            |
| Sebesta (2010)            | The paper aims to assist end user organisations in deciding the most suited ICT sourcing solution.  | Research Work   | Illustrative Example                  |
| Sebesta (2013)            | The paper aims to analyse available outsourcing models in the literature and presents an integrated view on IT outsourcing strategies.                | Researh Analysis,<br>Strategy Development                               | Illustrative Example                  |

Table 2.2.e Cloud Computing Technology Literature Survey

| Authors                  | Objective of the Study  | Method  | Case<br>Study/Illustrative<br>Example |
|--------------------------|---|---|---------------------------------------|
| Sebesta & Vorisek (2010) | The paper aims to provide a view on management and outsourcing of ICT services.   | Research Study  | Illustrative<br>Example               |
| Sultan (2011)            | The paper aims to demonstrate the economic viability (and flexibility) of using cloud computing by a UK-based SME.  | Interview   | Case Study                            |
| Ukor & Carpenter (2011)  | The paper aims to presents a new problem model for service selection based on the notion of request tokens.   | Integer programming,<br>Tree-search heuristic,<br>Genetic Algorithm | Case Study                            |
| Wang & He (2014)         | The paper aims to explore the successful service strategies of small cloud service providers in the cloud service market.                                       | Interviews, Cloud<br>Service Strategy<br>Matrix                     | Case Study                            |
| Willcocks et. al. (2013) | The paper aims to understand the factors that drive and inhibit the adoption of cloud computing in relation to its use for innovative practices.                | Surveys and<br>Interviews   | Case Study                            |
| Wu et. al. (2013)        | The paper aims to investigate the circumstances that affect a firm's intention to adopt cloud computing technologies in support of its supply chain operations. | Regression Analysis   | Case Study                            |
| Yiming & Yiwei (2011)    | The paper aims to provide a method for the enterprises to select the best SaaS vendor.  | MCDM-Fuzzy AHP  | Illustrative<br>Example               |

# 2.1.4 LITERATURE SURVEY FOR CLOUD COMPUTING TECHNOLOGY EVALUATION

Considering the evaluation of cloud computing technology services, (MCDM) techniques are accepted as effective tools (Whaiduzzaman et al. 2014), and hybrid fuzzy MCDM approaches have been used to improve service levels and meet user needs to assess the quality of cloud computing technology services. Many small and medium size businesses concern about the trustworthiness of cloud-based services which is also a Multi-Attribute Decision Making problem under the fuzziness of human judgment (Fan et al. 2014).

While AHP has been applied widely in different domains, the use of ANP in IT outsourcing studies is still relatively uncommon. Cao et al. (2012) proposed a hybrid model using ANP and Grey Relational Analysis (GRA) for bank's IT outsourcing vendor selection. Li and Brien (2012) focused on employing suitable metrics for evaluating cloud computing technology services. Alshamaila et al. (2012) identified the main factors in SME adoption of cloud services as relative advantage, innovativeness, supplier efforts and external computing support. To identify a wide spectrum of taxonomy, Rimal & Choi (2011) aimed at a better understanding of functional as well as architectural components that could benefit from cloudification. A multi-criteria-based decision framework offered by Menzel et al. (2011) can be applied to cloud computing technology which allows organizations to create evaluation methods for their needs. (AHP) was also used to select the best SaaS analyzing the related attributes (Yiming & Yiwei, 2011).

The other researches in cloud computing technology evaluation in the literature are, survey of cloud platforms and their future (Rad et al., 2009), cloud services measures for global use (Siegel & Perdue, 2012), Multi-criteria cloud service search engine for cloud computing systems (Kang & Sim, 2010), towards application performance prediction in cloud (Li et al., 2011), comparison of several cloud computing platforms (Peng et al., 2009), ontology and search engine for cloud computing system (Kang & Sim, 2011).

Table 2.3.a Cloud Computing Technology Evaluation Literature Survey

| Authors                  | Objective of the Study   | Method                 | Illustrative<br>Example/Case Study |
|--------------------------|--|------------------------|------------------------------------|
| Alabool & Mahmood (2013) | The paper aims to select the Cloud Infrastructure Service (CIS) according to trust criteria.   | MCDM-Fuzzy Set, VIKOR  | Illustrative Example               |
| Alhamad et. al. (2010)   | The paper aims to develop performance metrics to measure and compare the scalability of the resources of virtualization on the cloud data centres. | Benchmarking           | Case Study                         |
| Chen et al. (2010)       | The paper aims to select a suitable outsourcing manufacturing partner in pharmaceutical R&D.   | MCDM-Fuzzy TOPSIS      | Case Study                         |
| Chang et al. (2012)      | The paper aims to select cloud service providers in order to maximize the benefits with a given budget.  | Dynamic Programming    | Case Study                         |
| Chen et al. (2012)       | The paper aims to help enterprises in tackling problems when adopting cloud computing.   | Constraint Programming | Case Study                         |
| Chiu & Agrawal (2010)    | The paper aims to evaluate caching and storage options on the Amazon Web Services Cloud.   | Experimental Comparing | Case Study                         |

Table 2.3.b Cloud Computing Technology Evaluation Literature Survey

| Authors              | Objective of the Study  | Method                          | Case Study/Illustrative<br>Example |
|----------------------|---|---------------------------------|------------------------------------|
| Cunha et. al. (2011) | The paper aims to investigate the Impact of deployment configuration and user demand on a social network application in the Amazon EC2 Cloud. | Popular Cloud Benchmarking      | Case Study                         |
| Dou et. al. (2013)   | The paper aims to put forward a service evaluation method is to select an outsourcing service.  | Feasibility Study of the Method | Case Study                         |
| Ergu et al. (2013)   | The paper aims to propose a model for task-<br>oriented resource allocation in a cloud<br>computing environment.                              | MCDM-AHP                        | Illustrative Example               |
| Ergu & Peng (2013)   | The paper aims to propose a framework for SaaS software packages evaluation and selection.  | MCDM-ANP                        | Case Study                         |
| Fan et. al. (2014)   | The paper aims to assess cloud service trustworthiness.   | Fuzzy Gap Evaluation            | Case Study                         |

Table 2.3.c Cloud Computing Technology Evaluation Literature Survey

| Authors                 | Objective of the Study   | Method  | Case Study/Illustrative<br>Example  |
|-------------------------|--|---|-------------------------------------|
| Karim et al. (2013)     | The paper aims to map the users' QoS requirements of cloud services to the right QoS specifications of SaaS.   | MCDM-AHP  | Illustrative Example,<br>Case Study |
| Kossmann et. al. (2010) | The paper aims to list alternative architectures affecting cloud computing for database applications.  | Benchmarking  | Case Study                          |
| Le et al. (2014)        | The paper aims to address the issue of uncertainty in cloud service requests, service descriptions, user and expert preferences, as well as evaluation criteria. | Fuzzy MCDM-Fuzzy TOPSIS,<br>Fuzzy AHP, Fuzzy Ontology | Illustrative Example                |
| Lee et. al. (2013)      | The paper aims to evaluate SaaS.   | Balanced Scorecards                                   | Case Study                          |
| Li et al. (2011)        | The paper aims to compare public-cloud providers.  | Performance Comparison                                | Illustrative Example                |
| Li et. al. (2012)       | The paper aims to employ suitable metrics for evaluating commercial cloud services.  | Systematic Literature<br>Review                       | Illustrative Example                |
| Li et. al. (2013)       | The paper aims to synthesize the existing evaluation implementations and to outline the state of-the-practice.   | Systematic Literature Review                          | Illustrative Example                |

Table 2.3.d Cloud Computing Technology Evaluation Literature Survey

| Authors              | Objective of the Study  | Method                                     | Case Study/Illustrative<br>Example |
|----------------------|---|--|------------------------------------|
| Garg et al. (2011)   | This paper aims to define all key performance metrics for QoS attributes in the SMI framework.                | MCDM-AHP                                   | Case Study                         |
| Ghosh et. al. (2014) | The paper aims to compute risk involved in interacting with a given cloud service provider.                   | Risk Estimation                            | Case Study                         |
| Iosup et al. (2011)  | Performance analysis of cloud computing services for many-tasks scientific computing.                         | Benchmarking                               | Case Study                         |
| Jung et al. (2013)   | The paper aims to introduce a cloud recommendation platform, referred to as CloudAdvisor.                     | Benchmarking-based Approximation Technique | Case Study                         |
| Low & Chen (2012)    | The paper aims to examine the critical criteria for outsourcing the cloud-based hospital information systems. | MCDM-Fuzzy Delphi Method<br>and Fuzzy AHP  | Case Study                         |

Table 2.3.e Cloud Computing Technology Evaluation Literature Survey

| Authors                       | Objective of the Study  | Method   | Case Study/Illustrative<br>Example |
|-------------------------------|---|--|------------------------------------|
| Martens & Teuteberg (2012)    | The paper aims to determine the selection of Cloud Computing services.  | Simulation, Sensitivity<br>Analysis of the Model | Illustrative Example               |
| Menzel et al. (2013)          | TThe paper aims to offer a multi-criteria-<br>based decision framework that can be<br>applied to Cloud computing.       | Multi-Criteria Comparison<br>Method              | Illustrative Example               |
| Ni et. al. (2012)             | The paper aims to help the service outsourcing process in cloud platform.   | Research Work                                    | Illustrative Example               |
| Ooi et al. (2011)             | The paper aims to compare the existing resource selection methods.  | Resource Evaluation<br>Technique, Fuzzy Logic    | Illustrative Example               |
| Ouedraogo & Mouratidis (2013) | The paper aims to select a cloud service provider in the age of cybercrime.   | C.A.RE   | Case Study                         |
| Petcu (2014)                  | The paper aims to propose a specific taxonomy on multiple Cloud topics.   | Taxonomy   | Case Study                         |
| Prodan & Ostermann (2009)     | The paper aims to establish a taxonomy that identifies a common terminology, architectural and functional similarities. | Taxonomy   | Illustrative Example               |

Table 2.3.f Cloud Computing Technology Evaluation Literature Survey

| Authors                     | Objective of the Study   | Method   | Case Study/Illustrative<br>Example |
|-----------------------------|--|--|------------------------------------|
| Qu & Buyya (2014)           | The paper aims to support cloud service selection proposing a new personalized trust evaluation system.  | Hierarchical Fuzzy Inference<br>System           | Case Study                         |
| Rehman et al. (2014)        | The paper aims to present a quality of service history of cloud services over different time periods.    | Parallel Multi-Criteria<br>Decision Analysis     | Case Study                         |
| Rimal & Choi (2011)         | The paper aims to identify a wide spectrum of taxonomy   | Service-Oriented Taxonomical<br>Spectrum         | Illustrative Example               |
| Ristova & Gecevska (2011)   | The paper aims to provide a tool for decision makers regarding their investment in such of technologies. | MCDM-AHP   | Illustrative Example               |
| Saripalli & Pingali (2011)  | The paper aims to present a MADMAC framework for adoption of clouds.                                     | Multi Attribute Decision<br>Making-Delphi Method | Illustrative Example               |
| Silas et al. (2012)         | The paper aims to propose an efficient service selection middleware for Cloud environment.               | MCDM-ELECTRE                                     | Illustrative Example               |
| Sun et al. (2013)           | The paper aims to select customer-centered cloud services.   | MCDM-AHP   | Case Study                         |
| Sun et al. (2014)           | The paper aims to survey state-of-the-art cloud service selection approaches.                            | Literature Review                                | Illustrative Example               |
| Sundareswaran et al. (2012) | The paper aims to propose a novel brokerage-based architecture for cloud service selection.              | Indexing Technique                               | Illustrative Example               |

Table 2.3.g Cloud Computing Technology Evaluation Literature Survey

| Authors                     | Objective of the Study   | Method   | Case Study/Illustrative<br>Example |
|-----------------------------|--|--|------------------------------------|
| Walterbusch et. al. (2013)  | The paper aims to present a (TCO) approach for evaluating cloud computing services.                      | Multi-Method approach                            | Illustrative Example               |
| Wang et al. (2014)          | The paper aims to evaluate the quality of cloud service in service-oriented cloud computing.             | Fuzzy synthetic decision,<br>Fuzzy logic control | Illustrative Example               |
| Whaiduzzaman et. al. (2014) | The paper aims to present MCDM methods in Cloud Service Selection.                                       | Literature Review                                | Illustrative Example               |
| Yazır et al. (2010)         | The paper aims to propose a new approach for dynamic autonomous resource management in computing clouds. | MCDM-PROMETHEE                                   | Illustrative Example               |
| Zeng et al. (2009)          | The paper aims to describe the cloud service architecture and key algorithms about service selection.    | Two-step Algorithm.                              | Illustrative Example               |
| Zhao et al. (2012)          | The paper aims to find the appropriate services with satisfying the users'multiple QoS requirements.     | Service Scheduling Algorithm                     | Case Study                         |
| Zheng et al. (2013)         | The paper aims to identify the critical problem of personalized QoS ranking for cloud services.          | Similarity Computation                           | Case Study                         |

### 3. PROPOSED EVALUATION FRAMEWORK

A general view of the proposed cloud computing technology service provider evaluation framework is shown in Figure 3.1. Based on this framework, we identify firstly the cloud computing technology service provider evaluation criteria and we present the proposed integrated evaluation methodology in the following sub-sections.

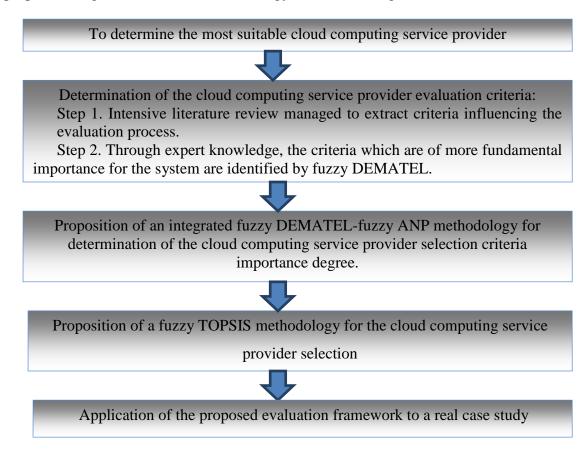


Figure. 3.1 A general view of the proposed evaluation framework

A set of complex criteria under different dimensions divided into a cause group and an effect group considering the interdependence among criteria. According to the results of fuzzy DEMATEL method, essential criteria for dimensions are figured out with combinings and extracts from the proposed framework, based upon the consensus of experts and academics

The service attributes are not independent of one another, and there are interdependencies between dimensions and attributes when evaluating different services. We need to consider more integrated techniques to model the relationships between multiple attributes and it must enable service selection based on mutually interdependent criteria. In view of this, firstly we determined the cloud computing service provider evaluation criteria, and then we proposed an integrated fuzzy DEMATEL-fuzzy ANP methodology for the cloud computing service provider selection, and after that we applied an application of this evaluation framework using fuzzy TOPSIS method.

# 3.1 CLOUD COMPUTING TECHNOLOGY SERVICE PROVIDER EVALUATION CRITERIA

After reviewing the related studies, cloud computing technology service provider selection is an important problem for users to compare different providers for the selection of an appropriate one to meet their needs. This problem must be determined as a MCDM problem involving multi-criteria and interdependent relationship between them. And there are also attributes like security which is really difficult to quantify. Seeing that, the introduction of an extensive set of criteria facilitates more precise evaluation results. Based on a detailed literature survey and interviews with industrial experts, seven evaluation dimensions were arranged according to different cloud computing technology service features covering the following aspects: Cloud security, cost, physical property, capacity, management services, service quality, vendor related.

To stay functional, legal and competitive; confidentiality, integrity, availability and auditability of business data are important criteria for businesses. The auditability feature has potential to give information about security and also drive the revision in addressing potential vulnerabilities that may emerge with time. (Ouedraogo & Mouratidis, 2013) The availability is the percentage of time a customer can use the cloud service which is an important characteristic according to user perspective.

Hosting data under another organization's control is a critical issue in confidentiality concept especially for Banking, Security administration, Law Enforcement businesses verticals. Either maliciously or accidentally, a company's data can be tampered or leaked by cloud provider's employees, which can damage the reputation or finances of a company (Saripalli & Pingali, 2011). Involving data integrity and privacy, financial organizations generally need compliance with regulations.

A wide range of characteristics must be considered before moving to cloud computing technology. To measure the value of cost dimension for an alternative, all related costs in the decision making process need to be involved. In this way, the correctness of the decision making process becomes strengthened by adding more cost categories (Menzel et al. 2013). As one of the vital attributes, businesses analyze the cost evaluation metric when applying cloud computing technology to find answers the questions whether it is cost effective or not. The ability of expressing cost in the specific characteristics is highly adventageous for these business organizations. When faced with an outsourcing decision in cost incentive, it is recommended considering investment, maintenance, integration, flexibility and support costs for efficient decision making.

IT infrastructure must fulfill SLAs. Users want having stable and reliable cloud service but today high availability assurance isn't provided by most cloud vendors although they made huge investments to make their system reliable. Service-level agreement management gives customer level of guarantee within contract legal bound.

The detailed explanation of Service Quality is described in three criteria as SLA Management, Service Stability and Enrich Content. Service Stability defines the variability of a cloud service performance as promised to customers. To ensure good service quality, IT departments must pursue improved service levels for their efficient management of operations when it comes to consider the characteristics of enrich content. To meet the users' needs, the capabilities of suppliers must enable specializing in particular specifications which gives higher quality of outsourced services.

The sub-taxonomy of vendor related criteria consists of vendor's reputation, experience in related products, quality of support service attributes. Vendor reputation factor can be explained in two attributes, Number of clients/users defines the level of usage, which roughly indicates whether the product is fairly new entry or is well-established one. Sometimes a new product from well-known vendor may be preferred over a product having vast customer base which defines the brand value of vendor (Godse & Mulik, 2009). The experience in related products is an hardly measurable characteristic. Vendors' success in the completed projects and satisfied customers may indicate the experience in related products but not as a qualitative view. To fulfill customer expectations and lead creation of quality services, appropriate quality specifications of support services must be determined.

Management services consists of deployment, configuration, billing, reporting and monitoring. The trust level of user towards cloud services will be increased by transparent metering (QoS and SLA aware). Pay-as-you go subscription or pay as you consume model of billing are introduced to charge the customer for resource usages (server-RAM-hours, gigabyte-storage-hours, CPU-hours, network bandwidth, server-configuration hours) (Rimal & Choi, 2012).

We need a monitoring and reporting mechanism to face problems such as increased management costs, and complex performance related factors. Monitoring systems record the resource utilization (such as CPU, RAM, disk, bandwidth) on each node. (Rimal & Choi, 2012). Performance feature can be divided into two parts as Physical Property part and Capacity part. A combination of a physical property of cloud service and its capacity represent an evaluated performance feature. All these elements of performance features are Communication, Computation, Memory and Storage in Physical Property part; Transaction Speed, Availability, Latency (Time), Reliability in Capacity part. (Rimal & Choi, 2012)

It is hard to evaluate the performance of cloud services without having knowledge and control over those services for cloud provider selection. In practise, a combination of a physical property of cloud services and its capacity represents an evaluated performance

feature. (Li, et al 2012) Seeing that, performance feature can be divided into two parts as Physical Property part and Capacity part. All these elements of performance features are Communication, Computation, Memory and Storage in Physical Property part; Transaction Speed, Availability, Latency (Time), Reliability in Capacity part.

Spesifically, when adopting cloud services through Internet/network, communication will inevitably appear and it is not an internal physical property of cloud services. To reflect the computation of a commercial service, we can directly evaluate the virtual CPU, if the service exists as virtual machine (VM) instances. Memory and Cache can be treated as a unified physical property of cloud services. For storage property, different cloud services for example Amazon S3, vs. EC2. can supply storage either as the main functionality or partial respectively (Li, et al 2012).

The vendor-specific factors include vendor's reputation, experience in related products and quality of support services. The success of cloud computing technology services is directly affected by the vendor related dimension. It is important that we examine all these relevant factors in selecting a cloud computing technology system and a vendor who designs and delivers the system. There is a need systematic process of identifying and prioritizing relevant criteria and evaluating the trade-offs between technical, economic and performance criteria. (Tam & Tummala, 2001) Vendors' success in the completed projects and satisfied customers may indicate the experience in related products but not as a qualitative view. To fulfill customer expectations and lead creation of quality services, appropriate quality specifications of support services must be determined.

Garg et al. (2011) propose a framework (Service Measurement Index-Cloud) that can compare different cloud providers based on user requirements helping users to select whatever is appropriate to their needs. Seeing this framework, we can not easily quantify the attributes like security and user experience. This is a problem of multi-criteria decision-making involving multi-criteria and an interdependent relationship between them. The authors defines the stability critera for storage as the variance in the

average read and write time. For computational resources, stability is described as the deviation from the performance specified in SLA.

To check the integrity and availability of the stored data, offering an efficient audit service by cloud service provider is necessary (Zhu et. al. 2012). And it is important to realize public auditability for CSS, so that data owners may resort to a TPA for periodically auditing the outsourced data.

R&D capability is a quantitative and positive attribute whose initial value can be the R&D investment of cloud vendors every year (Yimig & Yiwei, 2011). For Community support, the bigger the community that a cloud service has, the more support the firms can have. Community is a crucial part in the growth of an cloud technology (Lee et al, 2014). They can contribute to the development of the services and make it larger and more powerful. Support from the community is often in the form of documentation, plugins or add-on packages, bug detection, module development, and so on. "The amount of activity within the community is important to an open source project, as a thriving community will drive updates for the software, and increase the number of bugs reported and removed" (Bruce et al. 2006).

Cloud computing technology outsourcing dimensions and criteria is shown in Table 3.1.

Table 3.1 Cloud Computing Technology Outsourcing Dimensions and Criteria

| Dimenison  | Criteria              | Definition   |
|--|-----------------------|--|
|  |                       |  |
| A: Cloud Security<br>(Garg et al., 2013; Saripalli &<br>Pingali, 2011; Su et al., 2012;<br>Sun et al., 2014) | Confidentiality       | *In the cloud, special attention should be paid on the confidentiality of the transactional information, in addition to the storage and processing of consumer's information. (Martens & Teuteberg, 2012; Ouedraogo & Mouratidis, 2013)                        |
|  | Integrity             | *Describes avoiding security risks of missing or corrupted data to ensure the integrity of outsourced data. (Godse & Mulik, 2009; Martens & Teuteberg, 2012; Zhu et al. 2012)  |
|  | Availability          | *Characterises the extent to which computational resources are accessible and usable during a given time frame. (Jung et al. 2013; Martens & Teuteberg, 2012; Ouedraogo & Mouratidis, 2013)  |
|  | Auditability          | *Descibes the potential to allow one to get information on the status of the security but also drive the revision of the security in view of addressing potential vulnerabilities that may emerge with time. (Garg et al., 2013; Ouedraogo & Mouratidis, 2013) |
|  | Multi-tenant<br>Trust | *Describes the interaction of the system as expected. (Ghosh et al., 2013; Qu & Buyya, 2014)   |
| <b>B: Cost</b> (Ergu & Peng, 2014; Qu &  | Investment Cost       | *Describes direct initial costs to obtain and locate the IT Infrastructure. (Menzel et al. 2013)   |
| Buyya, 2014; Low & Chen, 2012; Menzel et al. 2013; Silas et al., 2012; Su et al, 2012; Zeng et. al, 2009)    | Maintenance<br>Cost   | *Describes frequently arising costs to maintain the IT infrastructure. (Ergu & Peng, 2014; Low & Chen, 2012; Martens & Teuteberg, 2012; Menzel et al. 2013)  |
| ,  | Integration Cost      | *Describes the cost of integration of the IT infrastructure into the processes of the organization. (Menzel et al. 2013)   |
|  | Flexibility Cost      | *Further IT infrastructure changes can raise the costs. (Tsai et al., 2010; Menzel et al. 2013)  |
|  | Support Cost          | *Describes the expenses for support requests or consultants that should be considered in the overall costs. (Ergu & Peng, 2014; Menzel et al. 2013)  |
| C: Physical Property Part (Li, et al. 2012)  | Communication         | *The data/message transfer between internal service instances, or between external client and the Cloud. (Li et al. 2012)  |
|  | Computation           | *Refers to the computing-intensive data/job processing in the cloud. (Li et al. 2012)  |
|  | Memory                | *Memory (Cache) is intended for fast access to temporarily saved data. (Garg et al., 2013; Li et al. 2012)   |
|  | Storage               | *Storage is used to permanently store users' data, until the data are removed or the services are suspended intentionally. (Chang et al., 2012; Garg et al., 2013; Li et al. 2012; Ni & Yan, 2012)   |

| D: Capacity Part (Garg et al., 2013; Li, et al 2012; Low & Chen, 2012; Yang et al. 2013) | Transaction Speed Availability  Latency (Time)  Reliability | *Describes how fast transactions can be processed. (Li et al. 2012)  *Describes the probability a system works in functioning condition. (Chang et al., 2012; Garg et al., 2013; Li, et al. 2012; Yang et al. 2013; Zeng et. al, 2009)  *Latency is related to the measure of time delay for a particular job. (Alhamad et al., 2010; Li, et al. 2012)  *The probability a system can properly perform its intended function. (Li et al. 2012; Low & Chen, 2012; Garg et al., 2013; Godse & Mulik, 2009; Silas et al., 2012; Yang et al. 2013) |
|--|---|--|
| E:Management Services<br>(Rimal & Choi 2012)   | Deployment  | *Three stages of cloud application deployment lifecycle such as design, manage and deploy that need to be automated processes to reduce the burden across cloud deployment.  |
|  | Configuration   | *Automated configuration of computers from the policy specification is very important for complex cloud environment.   |
|  | Billing   | *Pay-as-you go subscription or pay as you consume model of billing for resource usages . (server-RAM-hours, gigabyte-storage-hours, CPU-hours etc) (Rimal & Choi, 2012)  |
|  | Reporting   | *Describes the system that provides reporting stuffs   |
|  | Monitoring  | and produce the health report. (Rimal & Choi, 2012) *Describes monitoring cloud systems directly and easily with monitoring systems that record the resource utilization (such as CPU, RAM, disk, bandwidth) on each node. (Rimal & Choi, 2012)  |
| F: Service Quality<br>(Rimal & Choi, 2012; Tsai &<br>Leu, 2010; Yiming & Yiwei,<br>2011) | SLA<br>Management   | *SLA is a component to negotiate and establish resource agreements between resource consumers and resource provider. (Ghosh et al., 2013; Rimal & Choi, 2012)  |
| _012)  | Service Stability   | *Describes providing services to customers as expected or promised. (Alhamad et al., 2010; Garg et al. 2012; Yiming & Yiwei, 2011; Karim et al. 2013),   |
|  | Enrich Content  | *The quality aspects of the cloud service content. (Tsai & Leu, 2010)  |
| G: Vendor Related<br>(Low & Chen, 2012; Cardoso<br>et al. 2004; Tam & Tummala,<br>2001)  | Vendor's<br>Reputation                                      | *Includes two attributes; <i>Number of clients/users</i> , and <i>the brand value of vendor</i> . (Ghosh et al., 2013; Sun et al., 2014; Tam & Tummala, 2001; Yiming & Yiwei,2011),  |
| •  | Experience in related products                              | *Experience of vendor about development of the software products (Alshamaila, 2012; Ghosh et al. 2013; Jadhav & Sonar, 2009; Low & Chen, 2012)   |
|  | Quality of support service                                  | *Quality of support service requires the modification and extension of several workflow system components, and the development of additional modules. (Alhamad et al., 2010; Cardoso et al. 2004; Ni & Yan, 2012)  |

Community support R&D capability

\*The bigger the community that a cloud service has, the more support the firms can have. (Lee et al, 2014) \*A quantitative and positive attribute whose initial value can be the R&D investment of cloud vendors every year. (Su et al., 2012; Yiming & Yiwei, 2011)

## 3. 2 INTEGRATED FUZZY MCDM METHODOLOGY

# 3.2.1. FUZZY THEORY

Fuzzy Set Theory was introduced by Zadeh (1965) in order to deal with the vagueness of human thought and different linguistics variables in decision making. A fuzzy set is a class of objects with a continuum of grades of membership. Such a set is characterized by a membership function which assigns to each object a grade of membership ranging between zero and one (Zadeh, 1965).

Most operation managers also cannot provide exact numerical values to express opinions based on human perception and more realistic measurement uses linguistic assessments. Metrics can be measured as linguistic labels such as very high, high, middle, low, and very low (Wang & Chuu, 2004). It is better to convert the linguistic estimation into fuzzy numbers to integrate opinions, ideas, and motivations of an individual decision-maker. Thus, the group decision-making problems have created a need to employ fuzzy logic (Lin & Wu, 2008). In practice, the triangular fuzzy number is commonly used. In the following, some essential definitions of fuzzy set theory were reviewed (Chen, 1996; Tseng & Lin, 2008),

Let *X* be the universe of discourse,  $X = \{x_1, x_2, x_3, \dots x_n\}$ .

A fuzzy set  $\tilde{A}$  of X is a set of order pairs  $\{(x_1, f_{\tilde{A}}(x_1)), (x_2, f_{\tilde{A}}(x_2), (x_3, f_{\tilde{A}}(x_3))\}$ , where  $f_{\tilde{A}}: X \to [0, 1]$  is the membership function of  $\tilde{A}$  and  $f_{\tilde{A}}(x_i)$  stands for the membership degree of  $x_i$  in  $\tilde{A}$ .

**Definition 1** When *X* is a continuous rather than a countable or finite set, the fuzzy set  $\tilde{A}$  is denoted as:  $\tilde{A} = \int X f_{\tilde{A}}(x_i)/(x)$ , where  $x \in X$ .

**Definition 2** When *X* is a countable or finite set, the fuzzy set  $\tilde{A}$  is represented as  $\tilde{A} = \sum_{i} f_{\tilde{A}}(x_i)/(x_i)$ , where  $x_i \in X$ .

**Definition 3** A fuzzy set  $\tilde{A}$  of the universe of discourse X is normal when its membership function  $f_{\tilde{A}}(x)$  satisfies max  $f_{\tilde{A}}(x) = 1$ .

**Definition 4** A fuzzy number is a fuzzy subset in the universe of discourse X that is not convex but also normal.

**Definition 5** The fuzzy  $\alpha$ -cut  $\tilde{A}_{\alpha}$  and strong  $\alpha$ -cut  $\tilde{A}_{\alpha^+}$  of the fuzzy set  $\tilde{A}$  in the universe of discourse X is defined by

$$\tilde{A}_{\alpha} = \{ x_i | f_{\tilde{A}}(x_i) \ge \alpha, x_i \in X \}, \text{ where } \alpha \in [0,1]$$

$$\tilde{A}_{\alpha^+} = \{ x_i | f_{\tilde{A}}(x_i) \ge \alpha, x_i \in X \}, \text{ where } \alpha \in [0,1]$$

$$(1)$$

**Definition 6** A fuzzy set  $\tilde{A}$  of the universe of discourse X is convex if and only if every  $\tilde{A}_{\alpha}$  is convex, that is  $\tilde{A}_{\alpha}$  is a close interval of R. It can be written as

$$\tilde{A}_{\alpha} = [P_1^{(a)}, P_2^{(a)}], \text{ where } \alpha \in [0,1]$$
 (2)

**Definition 7** A triangular fuzzy number (TFN) can be defined as a triplet  $(\alpha_1, \alpha_2, \alpha_3)$ ; the membership function of the fuzzy number  $\tilde{A}$  is defined.

$$f_{\tilde{A}}(x) = \begin{cases} 0, & x < \alpha_1 \\ (x - \alpha_1)/(\alpha_2 - \alpha_1), \alpha_1 \le x \le \alpha_2, \\ (\alpha_3 - x)/(\alpha_3 - \alpha_2), \alpha_2 \le x \le \alpha_3, \\ 0, & x > \alpha_3 \end{cases}$$
(3)

Let  $\tilde{A}$  and  $\tilde{B}$  be two TFN parameterized by the triplet  $(\alpha_1, \alpha_2, \alpha_3)$  and  $(b_1, b_2, b_3)$  respectively, then the operational laws of these two TFN as follows:

$$\tilde{A} (+) \tilde{B} = (\alpha_{1}, \alpha_{2}, \alpha_{3}) (+) (b_{1}, b_{2}, b_{3})$$

$$= (\alpha_{1} + b_{1}, \alpha_{2} + b_{2}, \alpha_{3} + b_{3})$$

$$\tilde{A} (-) \tilde{B} = (\alpha_{1}, \alpha_{2}, \alpha_{3}) (-) (b_{1}, b_{2}, b_{3})$$

$$= (\alpha_{1} - b_{1}, \alpha_{2} - b_{2}, \alpha_{3} - b_{3})$$

$$\tilde{A} (\times) \tilde{B} = (\alpha_{1}, \alpha_{2}, \alpha_{3}) (\times) (b_{1}, b_{2}, b_{3})$$

$$= (\alpha_{1}b_{1}, \alpha_{2}b_{2}, \alpha_{3}b_{3})$$

$$\tilde{A} (\div) \tilde{B} = (\alpha_{1}, \alpha_{2}, \alpha_{3}) (\div) (b_{1}, b_{2}, b_{3})$$

$$(4)$$

= 
$$(a_1/b_3, a_2/b_2, a_3/b_1)$$
  
Where  $a_1, a_2$  and  $a_3$  are real numbers and  $a_1 \le a_2 \le a_3$ .

There are different kinds of defuzzification methods which can be divided into two classes by considering either the vertical or the horizontal representation of possibility distribution (Oussalah, 2002). The most widely used defuzzification method is the Centroid (Center-of-gravity) Method (Yager & Filev, 1994). However, this method cannot distinguish two different-shaped fuzzy numbers which can be converted into the same crisp number (Wu & Lee, 2007). Therefore, this study applies the CFCS (Converting Fuzzy data into Crisp Scores) defuzzification method developed by Opricovic & Tzeng (2003) which can give a better crisp value than the Centroid method. The CFCS method is based on the procedure of determining the left and right scores by fuzzy minimum and maximum; the total score is determined as a weighted average according to the membership functions.

Let  $\widetilde{w}_{ij}^k = (a_{1ij}^k, a_{2ij}^k, a_{3ij}^k)$ ; suppose that a decision group has k members, take  $\widetilde{w}_{ij}^k$  to present the fuzzy weight of ith criteria which affects the jth criteria assessed by kth evaluators.

Normalization:

$$\begin{array}{l} xa_{1ij}^{k} = \left(a_{1ij}^{k} - \min a_{1ij}^{k}\right) / \Delta_{\min}^{\max} \\ xa_{2ij}^{k} = \left(a_{2ij}^{k} - \min a_{1ij}^{k}\right) / \Delta_{\min}^{\max} \\ xa_{3ij}^{k} = \left(a_{3ij}^{k} - \min a_{1ij}^{k}\right) / \Delta_{\min}^{\max} \end{array}$$
 (5)

Where  $\Delta_{\min}^{\max} = \max a_{3ij}^k - \min a_{1ij}^k$ 

Compute left (ls) and right (rs) normalized value:

$$xls_{ij}^{k} = xa_{2ij}^{k} / \left(1 + xa_{2ij}^{k} - xa_{1ij}^{k}\right)$$

$$xrs_{ij}^{k} = xa_{3ij}^{k} / \left(1 + xa_{3ij}^{k} - xa_{2ij}^{k}\right)$$
(6)

Compute total normalized crisp value  $x_{ij}^{k} = \left[x l s_{ij}^{k} \left(1 - x l s_{ij}^{k}\right) + x r s_{ij}^{k} x r s_{ij}^{k}\right] / \left[1 - x l s_{ij}^{k} + x r s_{ij}^{k}\right]$ (7)

Compute crisp values:  

$$w_{ij}^k = \min a_{1ij}^k + x_{ij}^k \Delta_{\min}^{\max}$$
 (8)

Integrate crisp values:

$$\widetilde{w}_j = \frac{1}{k} \left( \widetilde{w}_{ij}^1 + \widetilde{w}_{ij}^2 + \widetilde{w}_{ij}^3 + \dots + \widetilde{w}_{ij}^k \right) \tag{9}$$

## 3.2.2 FUZZY DEMATEL METHOD AND ITS LITERATURE SURVEY

There are some studies involving Fuzzy Theory and DEMATEL methods. Wu & Lee (2007) proposed an effective method combining fuzzy logic and DEMATEL to segment required competencies for better promoting the competency development of global managers. In order to verify management strategies and satisfy customer's needs, Hsu, Chen and Tzeng (2007) used the fuzzy DEMATEL for finding the key factors and attributes in building the structure relations of an ideal Customer's Choice Behavior Model. Traditional Technology Acceptance Model (TAM) studies establish and verify the model of causal relationship between variables by factor analysis or structural equation modeling (Lee et al. 2011). However, some technology is highly complicated, not all respondents have thorough comprehension and certain variables are not compatible with assumption of independence.

A wide range of criteria is used to analyze the quality of cloud computing technology services. But it can be difficult to effectively analyze and increase usage intentions of cloud computing technology services when the criteria have interdependent or interactive characteristics. Therefore, Su et al. 2012 modeled strategies that can be pursued to improve the adoption of cloud services for green innovation entertainment purposes in Taiwan using a novel hybrid fuzzy MCDM method that combines the fuzzy concept with the DEMATEL (used to construct the FSINRM), fuzzy DANP (used to determine the relative weights of the criteria) and fuzzy VIKOR (used to determine the improvement priority) methods. To identify main Green Supply Chain Management criteria described in practices, performances and external drivers, Lin (2013) proposed fuzzy DEMATEL method trying to discover the interactive relationships.

Many enterprises consider outsourcing to be an operational initiative to increase competitiveness, reduce costs and risks and enhance operating flexibility (Su et al. 2012). Datta & Mahapatra (2014) proposed a hierarchical IT Outsourcing risk structure

representation to develop a formal model for qualitative risk assessment using the concept of 'Incentre of centroids method' in generalized trapezoidal fuzzy numbers. Fuzzy DEMATEL method literature survey is shown in Table 3.2.

Table 3.2.a Fuzzy DEMATEL Method Literature Survey

| Authors              | Objective of the Study   | Method                      | Case<br>Study/Illustrative<br>Example | Country | Firm                     |
|----------------------|--|-----------------------------|---------------------------------------|---------|--------------------------|
| Chang et. al. (2011) | This study aims to find influential factors in selecting Supply Chain Management suppliers.  | Fuzzy DEMATEL               | Case Study                            | Taiwan  | Electronic<br>Industries |
| Chen et. al. (2008)  | This study aims to develop a causal and dffect model of hot spring service quality expectation.  | Fuzzy DEMATEL               | Case Study                            | Taiwan  | Hot Spring<br>Hotel      |
| Chou et. al. (2012)  | This study aims to evaluate the performance of Human Resource for Science and Technology (HRST).   | Fuzzy AHP, Fuzzy<br>DEMATEL | Illustrative Example                  |         |                          |
| Fekri et. al. (2009) | This study aims to help the NPD (New Product Development) managers for improving their decision making quality.  | Fuzzy DEMATEL               | Case Study                            | Iran    | Iranian<br>Companies     |
| Hiete et. al. (2012) | This study aims to analyze and correct for relations between variables in a composite indicator for disaster resilience.   | Fuzzy DEMATEL               | Illustrative Example                  |         |                          |
| Hsu et. al. (2007)   | This study aims to find a more useful way to solve customers purchasing-decision problems and construct a Customer's Choice Behavior Model (CCBM) for Customer's Choice. | Fuzzy DEMATEL               | Case Study                            | Taiwan  | Automobile<br>market     |

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Table 3.2.b Fuzzy DEMATEL Method Literature Survey

| Authors                | Objective of the Study   | Method   | Case<br>Study/Illustrative<br>Example | Country | Firm                              |
|------------------------|--|--|---------------------------------------|---------|-----------------------------------|
| Hung et. al. (2007)    | This study aims to help managers in assessings complex and confusing situations, initiating Knowledge Management, identifying the causal relationships between problems.               | Fuzzy DEMATEL                                    | Illustrative Example                  |         |                                   |
| Jassbi et. al. (2011)  | This study aims to build the structural relationships among the strategic objectives for a strategy map.   | Fuzzy DEMATEL,<br>Strategy mapping               | Case Study                            | Iran    | Saipa Yadak<br>Trading<br>Company |
| Jeng & Tzeng<br>(2012) | The study aims to examine whether social influence affects medical professionals' behavioral intention to use while introducing a new Clinical Decision Support System (CDSS).         | Technology Acceptance Model (TAM), Fuzzy DEMATEL | Case Study                            | Taiwan  | Medical<br>Center                 |
| Lin (2013)             | This study aims to examine the influential factors among eight criteria of three main Green Supply Chain Management practices, namely practices, performances, and external pressures. | Fuzzy DEMATEL                                    | Illustrative Example                  |         |                                   |
| Lin & Wu (2008)        | This study aims to gather group ideas and analyze the cause–effect relationship of complex problems in fuzzy environments.   | Fuzzy DEMATEL                                    | Illustrative Example                  |         |                                   |

Table 3.2.c Fuzzy DEMATEL Method Literature Survey

| Authors                 | Objective of the Study   | Method  | Case<br>Study/Illustrative<br>Example | Country | Firm                                    |
|-------------------------|--|---|---------------------------------------|---------|---|
| Lin et. al. (2011)      | This study aims to aid in GSCM performance evaluation in the industry under uncertainty.   | Fuzzy<br>DEMATEL                                | Case Study                            | Taiwan  | Automobile<br>Manufacturing<br>Industry |
| Liou et. al. (2008)     | This study aims to build an effective safety management system for airlines.   | Fuzzy<br>DEMATEL                                | Case Study                            | Taiwan  | Taiwanese civil<br>aviation<br>industry |
| Lee et. al. (2011)      | This study aims to calculate the causal relationship and level of mutual effect, building on the technology acceptance model by applying the Product Life Cycle Management (PLM) system. | Fuzzy DEMATEL, Technology Accetance Model       | Case Study                            | Taiwan  | AUO Optronics<br>Corporation            |
| Su et. al. (2012)       | This study aims to improve the adoption of cloud services for green innovation entertainment purposes in Taiwan.   | Fuzzy<br>DEMATEL,<br>Fuzzy DANP,<br>Fuzzy VIKOR | Case Study                            | Taiwan  | Mobile communications industry          |
| Samantra et. al. (2014) | This study aims to develop a unified hierarchical risk model that can effectively be used to estimate the degree of risk extent in IT outsourcing.                                       | Fuzzy Set<br>Theory                             | Case Study                            | India   | One of the leading IT Industry          |

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Table 3.2.d Fuzzy DEMATEL Method Literature Survey

| Authors              | Objective of the Study  | Method                               | Case<br>Study/Illustrative<br>Example | Country         | Firm                           |
|----------------------|---|--------------------------------------|---------------------------------------|-----------------|--------------------------------|
| Tseng (2009)         | This study aims to present a perception approach to deal with real estate agent service quality expectation ranking with uncertainty.   | Grey theory Fuzzy set theory DEMATEL | Case Study                            | Taiwan          | Real Estate<br>Agent           |
| Tseng & Lin (2009)   | This study aims to build up a cause and effect model for the government of Metro Manila.  | Fuzzy<br>DEMATEL                     | Case Study                            | Metro<br>Manila | Government                     |
| Tseng et. al. (2011) | This study aims to prove the impact of IT in supply chain management.   | Fuzzy<br>DEMATEL                     | Case Study                            | Vietnam         | Vietnam<br>textile<br>industry |
| Wu (2012)            | This study aims to segment the critical factors for successful KM implementations.  | Fuzzy<br>DEMATEL                     | Case Study                            | Taiwan          | Company G                      |
| Wu et. al. (2007)    | This study aims to segment required competencies for better promoting the competency development of global managers.  | Fuzzy<br>DEMATEL                     | Case Study                            | Taiwan          | Company P                      |
| Zhou et. al. (2011)  | This study aims to identify the CSFs of emergency management, and classify and analyze these CSFs according to the structural relationship in order to improve emergency management systemically. | Fuzzy<br>DEMATEL                     | Illustrative Example                  |                 |                                |

### 3.2.3 FUZZY ANP METHOD AND ITS LITERATURE SURVEY

ANP is a general form of AHP first introduced by Saaty (1996). it has been used in solving many complicated problems. The AHP only employs a unidirectional hierarchical relationships among decision levels, but the ANP method is capable of handling interdependences through the stucture of a supermatrix. And these interdependencies must be evaluated within levels of clusters and mutually dependent elements in a cluster.

Unclear human judgment causes difficulties in determining exact numerical values, so fuzzy logic is logical in cloud service evaluation combining both fuzzy set theory and ANP. The use of the ANP in provider selection has increased substantially in recent years because this method can consider the interrelationships among elements in a problem setting.

In the literature many researches in different fields such as supplier selection as applied to IC packaging (Kang et al. 2012), and for measurement of the sectoral competition level (SCL) (Dagdeviren & Yuksel, 2010), selecting the location of distribution center (Wei & Wang, 2009), and proposing an experts knowledge-based systems measurement model (Chang et. al. 2011),

(Dargi et. al. 2014) focused on developing a framework to support the supplier selection process, (Ozgen & Tanyas, 2011) applied Fuzzy ANP to consider a joint selection of customs broker agency and international road transportation firm, (Changa et. al. 2015) evaluates the risk level for both intra-organizational cultures and for different industries in implementing an (ERP) system. Fuzzy ANP method literature survey is shown in Table 3.3.

Table 3.3.a Fuzzy ANP method Literature Survey

| Authors                    | Objective of the Study   | Method    | Case<br>Study/Illustrative<br>Example | Country | Firm                             |
|----------------------------|--|-----------|---------------------------------------|---------|----------------------------------|
| Ayub et. al. (2009)        | This study aims to provide an approach to minimizing subjective judgments in the crucial procedures of personnel selection.  | Fuzzy ANP | Illustrative Example                  |         |                                  |
| Boran et. al. (2010)       | This study aims to develop a fuzzy decision support system for commodity acquisition.  | Fuzzy ANP | Illustrative Example                  |         |                                  |
| Chang et. al.(2011)        | This study aims to propose an experts knowledge-based systems measurement model.   | Fuzzy ANP | Case Study                            | Taiwan  | Firm A, B, C, D                  |
| Chang et. al. (2015)       | This study aims to evaluate the risk level for both intra-organizational cultures and for different industries in implementing an enterprise resource planning (ERP) system. | Fuzzy ANP | Illustrative Example                  |         |                                  |
| Dagdeviren & Yuksel (2010) | This study aims to measure the sectoral competition level of an organization within the framework of Porter's five forces analysis.  | Fuzzy ANP | Case Study                            | Turkey  | Manufacturing<br>Company         |
| Dargi et. al. (2014)       | This study aims to develop a framework to support the supplier selection process.  | Fuzzy ANP | Case Study Iran                       |         | Automative<br>Company            |
| Guneri et. al. (2009)      | This study aims to present an approach for shipyard location selection.  | Fuzzy ANP | Illustrative Example                  |         |                                  |
| He et. al. (2014)          | This study aims to measure the complexity of mega construction projects in China.  | Fuzzy ANP | Case Study                            | China   | World<br>construction<br>project |

Table 3.3.b Fuzzy ANP Method Literature Survey

| Authors                 | Objective of the Study  | Method             | Case Study/Illustrative<br>Example | Country                | Firm                               |
|-------------------------|---|--------------------|------------------------------------|------------------------|------------------------------------|
| Isalou et. al. (2013)   | This study aims to locate a suitable location for landfilling municipal solid wastes generated in Iran. | Fuzzy ANP          | Case Study                         | Kahak<br>Town,<br>Iran | Sanitary Landfill site             |
| Jaafari et. al. (2015)  | This study aims to select the best wood extraction method.  | Fuzzy ANP,<br>BOCR | Case Study                         | Iran                   | Caspian<br>(Hyrcanian)<br>Forest   |
| Ju (2011)               | This study aims to implement risk assessment of runway excursion accident.                              | Fuzzy ANP          | Illustrative Example               |                        |                                    |
| Kang et. al. (2012)     | This study to evaluate various aspects of suppliers as applied to IC packaging.                         | Fuzzy ANP          | Case Study                         | Taiwan                 | IC Packaging factory               |
| Kumar & Maiti (2012)    | This study aims to model the problem of maintenance policy selection for an industrial unit.            | Fuzzy ANP          | Case Study                         | India                  | A chemical safety consultancy firm |
| Lin & Hsu (2011)        | This study aims to create a hierarchical framework for brand image management.                          | Fuzzy ANP          | Case Study                         | Taiwan                 | Four outstanding Department stores |
| Nuhodzic et. al. (2010) | This study aims to choose the optimal organizational structure of a rail company.                       | Fuzzy ANP          | Case Study Ser                     |                        | Montenegro<br>Railway              |

Table 3.3.c Fuzzy ANP Method Literature Survey

| Authors                  | Objective of the Study   | Method                                  | Case Study/Illustrative<br>Example | Country | Firm                                |
|--------------------------|--|---|------------------------------------|---------|-------------------------------------|
| Ozdagoglu (2012)         | This study aims to present a systematic approach to facility location and evaluation.                                  | Fuzzy ANP,<br>Fuzzy AHP                 | Case Study                         | Turkey  | Company from food Industry          |
| Ozgen & Tanyas<br>(2011) | This study aims to consider a joint selection of customs broker agency and international road transportation firm.     | Fuzzy ANP                               | Illustrative Example               |         |                                     |
| Qu et. al. (2009)        | This study aims to evaluate materiel support plan in development phase.  | Fuzzy ANP                               | Illustrative Example               |         |                                     |
| Razmi et. al. (2009)     | This study aims to evaluate and select suppliers designing a decision support system.                                  | Fuzzy ANP,<br>Non-linear<br>programming | Illustrative Example               |         |                                     |
| Razmi et. al. (2009)     | This study aims to develop a practical framework for ERP readiness assessment.   | Fuzzy ANP                               | Case Study Ira                     |         | Power (electricity) holding company |
| Sevkli et. al. (2012)    | This study aims to provide a quantitative basis to analytically determine the ranking of the factors in SWOT analysis. | Fuzzy ANP,<br>Fuzzy AHP                 | Case Study                         | Turkey  | Turkish airline industry            |
| Shafiee (2015)           | This study aims to select the "most appropriate risk mitigation strategy" for offshore wind farms.                     | Fuzzy ANP                               | Case Study                         |         | Offshore Wind<br>Farm               |

Table 3.3.d Fuzzy ANP Method Literature Survey

| Authors               | Objective of the Study   | Method    | Case Study/Illustrative<br>Example | Country | Firm                              |
|-----------------------|--|-----------|------------------------------------|---------|-----------------------------------|
| Vinodh et. al. (2010) | This study aims to select the best agile concept in a manufacturing organisation   | Fuzzy ANP | Fuzzy ANP Case Study               |         | Salzer,<br>Electronics<br>Limited |
| Vinodh et. al. (2011) | This study aims to determine best supplier in a manufacturing organisation.  | Fuzzy ANP | ANP Case Study                     |         | Salzer<br>Electronics<br>Limited  |
| Wei & Wang (2009)     | This study aims to select the location of distribution center.   | Fuzzy ANP | zzy ANP Illustrative Example       |         |                                   |
| Wei et. al. (2010)    | This study aims to select a supplier effectively in supply chain management.   | Fuzzy ANP | Illustrative Example               |         |                                   |
| Yang et. al.(2010)    | This study aims to translate the ambiguous and abstract concept of the trust into quantifiable, specific indicators to be evaluated. | Fuzzy ANP | Illustrative Example               |         |                                   |
| Yang et. al. (2010)   | This study aims to design a group decision support system under uncertainty.   | Fuzzy ANP | uzzy ANP Case Study                |         | Oil company                       |
| Yazgan (2011)         | This study aims to select a best dispatching rule.   | Fuzzy ANP | Illustrative Example               |         |                                   |

## 3.2.4 FUZZY TOPSIS METHOD AND ITS LITERATURE SURVEY

TOPSIS method was proposed by Hwang & Yoon (1981) based on the concept that the chosen alternative should have the shortest distance from the positive-ideal solution and the longest distance from the negative-ideal solution. Under many conditions, incomplete and non-obtainable data make accurate judgment impossible to model decision problems. Extension of the TOPSIS method to the fuzzy environment is necessary because in many conditions, the ratings of the alternatives are not known precisely and can not be treated as crisp numerical data. Triangular fuzzy number for fuzzy TOPSIS is used by the decision makers because of the easy usage to formulate decision problems (Rouhani et. al. 2012).

In literature, fuzzy TOPSIS method was applied in different field. Jiang et. al. adopted fuzzy TOPSIS to solve Group Belief MCDM problems. Chen (2011) used this method aiming at estimating the importance of criteria and reducing the leniency bias in multiple-criteria decision analysis based on interval-valued fuzzy sets.

Taylan et. al. (2014) applied fuzzy TOPSIS to use novel analytic tools to evaluate the construction projects and their overall risks under incomplete and uncertain situations. Chamodrakas & Martakos (2012) focused on the selection the optimal network which achieves the best balance between performance and energy consumption. Sun & Lin (2009) used this method to evaluate the competitive advantages of shopping websites. Kim et. al. (2013) aimed to prioritize the best sites for treated wastewater instream use in an urban watershed using fuzzy TOPSIS. Fuzzy TOPSIS method literature survey is shown in Table 3.4.

Table 3.4.a Fuzzy TOPSIS Method Literature Survey

| Authors                       | Objective of the Study   | Method                     | Case<br>Study/Illustrative<br>Example | Country | Firm |
|-------------------------------|--|----------------------------|---------------------------------------|---------|------|
| Awasthi et. al. (2011)        | This work aims to evaluate sustainable transportation systems.   | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Cavallaro (2010)              | This work to investigate the feasibility of utilizing a molten salt.   | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Chamodrakas & Martakos (2012) | This work aims to select the optimal network which achieves the best balance between performance and energy consumption.     | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Chen & Hung (2010)            | This study aims to select a suitable OMP in pharmaceutical R&D.  | Fuzzy TOPSIS,<br>Fuzzy AHP | Illustrative Example                  |         |      |
| Chen (2011)                   | This work aims to estimate the importance of criteria and reducing the leniency bias in multiple-criteria decision analysis. | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Chu & Lin (2009)              | This work aims to provide an interval arithmetic based fuzzy TOPSIS model.   | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Ghorbani et. al. (2011)       | This work aims to determine strategy priorities by SWOT analysis.  | Fuzzy TOPSIS               | Illustrative Example                  |         |      |
| Jiang et. al.(2011)           | This work aims to solve Group Belief MCDM problems.  | Fuzzy TOPSIS               | Illustrative Example                  |         |      |

Table 3.4.b Fuzzy TOPSIS Method Literature Survey

| Authors                      | Objective of the Study   | Method  | Case<br>Study/Illustrative<br>Example | Country        | Firm                                  |
|------------------------------|--|---|---------------------------------------|----------------|---------------------------------------|
| Junior et. al. (2014)        | This work aims to choose more effective approaches for supplier selection.   | Fuzzy TOPSIS,<br>Fuzzy AHP                                    | Illustrative Example                  |                |                                       |
| Kannana et. al. (2009)       | This work aims to guide the selection process of best third Party Reverse Logistics Provider.                                    | Fuzzy TOPSIS,<br>Interpretive<br>Structural<br>Modeling (ISM) | Case Study                            | India          | Battery<br>Recycling<br>Industry      |
| Kannan & Jabbour (2014)      | This work aims to select green suppliers for a Brazilian electronics company.  | Fuzzy TOPSIS  | Case Study                            | Brazil         | Electronics<br>Assembling<br>Company  |
| Kelemenis et. al. (2011)     | This work aims to support managers' selection.   | Fuzzy TOPSIS  | Illustrative Example                  |                |                                       |
| Kim et. al. (2013)           | This work aims to prioritize the best sites for treated wastewater instream use in an urban watershed.                           | Fuzzy TOPSIS  | Case Study                            | South<br>Korea | Ten sites in an urban watershed       |
| Krohling & Campanharo (2011) | This work aims to find out the best combat responses in case of accidents with oil spill in the sea.                             | Fuzzy TOPSIS  | Case Study                            | Brazil         | Brazilian Oil<br>Reservoirs           |
| Mahdevari et. al. (2014)     | This work aims to assess the risks associated with human health in order to manage control measures and support decision making. | Fuzzy TOPSIS  | Case Study                            | Iran           | Three<br>Underground<br>Coal<br>Mines |

Table 3.4.c Fuzzy TOPSIS Method Literature Survey

| Authors                      | Objective of the Study  | Method                        | Case<br>Study/Illustrative<br>Example | Country         | Firm                            |
|------------------------------|---|-------------------------------|---------------------------------------|-----------------|---------------------------------|
| Matin (2011)                 | This work aims to solve personnel selection problem.  | Fuzzy<br>TOPSIS               | Illustrative Example                  | Iran            | Padir<br>Company                |
| Roszkowsk & Wachowicz (2015) | This work aims to support the process of building the scoring system for negotiation offers in ill-structured negotiations.                                       | Fuzzy<br>TOPSIS               | Illustrative Example                  |                 |                                 |
| Rouhani et. al. (2012)       | This work aims to propose a new model to provide a simple approach to assess enterprise systems in business intelligence aspects.                                 | Fuzzy<br>TOPSIS               | Illustrative Example                  |                 |                                 |
| Singh & Benyoucef (2011)     | This study aims to solve the sealed bid,multi-<br>attribute reverse auction problem of e-sourcing<br>in which the sales item is defined by several<br>attributes. | Fuzzy<br>TOPSIS               | Illustrative Example                  |                 |                                 |
| Sun & Lin (2009)             | This work aims to evaluate the competitive advantages of shopping websites.   | Fuzzy<br>TOPSIS               | Illustrative Example                  |                 |                                 |
| Tansel & Yurdakul (2010)     | This work aims to develop a quick credibility scoring decision support system.  | Fuzzy<br>TOPSIS               | Case Study                            | Turkey          | Manufacturing<br>Firms          |
| Taylan et. al. (2014)        | This work aims to use novel analytic tools to evaluate the construction projects and their overall risks under incomplete and uncertain situations.               | Fuzzy<br>TOPSIS,<br>Fuzzy AHP | Case Study                            | Saudi<br>Arabia | King<br>Abdulaziz<br>University |
| Torlak et. al. (2011)        | This work aims to analyze business competition in the Turkish domestic airline industry.  | Fuzzy<br>TOPSIS               | Case Study                            | Turkey          | Turkish<br>Airline<br>Industry  |

Table 3.4.d Fuzzy TOPSIS Method Literature Survey

| Authors                     | Objective of the Study  | Method                        | Case<br>Study/Illustrative<br>Example | Country | Firm                             |
|-----------------------------|---|-------------------------------|---------------------------------------|---------|----------------------------------|
| Wang & Lee (2009)           | This work aims to develop a fuzzy TOPSIS approach based on subjective weights and objective weights.                        | Fuzzy<br>TOPSIS               | Illustrative Example                  |         |                                  |
| Wang et. al. (2009)         | This work aims to simplify the complicated metric distance method, and proposes an algorithm to modify Chen's Fuzzy TOPSIS. | Fuzzy<br>TOPSIS,<br>Fuzzy AHP | Illustrative Example                  |         |                                  |
| Wang (2014)                 | This work aims to evaluate of financial performance for Taiwan container shipping companies.                                | Fuzzy<br>TOPSIS               | Case Study                            | Taiwan  | Container<br>Shipping<br>Company |
| Zouggari & Benyoucef (2011) | This work aims to present a new decision making approach for group multi-criteria supplier selection problem.               | Fuzzy<br>TOPSIS,<br>Fuzzy AHP | Illustrative Example                  |         |                                  |

### 3.2.5 LITERATURE SURVEY FOR INTEGRATED METHODOLOGY

In order to develop a decision support system, integrated fuzzy DEMATEL, fuzzy ANP and Fuzzy TOPSIS methodology approaches evaluated from relevant studies summarized in Table 3.6.

# 3.3 THE PROPOSED INTEGRATED MCDM MODEL

The following explains the computational steps of the hybrid MCDM model that has been developed in this thesis for the purpose of cloud computing technology service provider ranking as follows,

**Step 1:** Determination of the evaluation model. After defining the alternatives, i.e., cloud computing technology service providers in this paper, the set of dimensions for their evaluation is formed, and then the set of criteria based on which the weights are defined. (Table 3.5)

**Step 2:** Design fuzzy linguistic scale for evaluations. Relationships among the structure's elements are defined using experts' opinions through paired comparison. To measure the relationships between elements, we need to design the linguistic scale with corresponding triangular fuzzy numbers to convert fuzzy numbers into a crisp score.

Table 3.5 Corresponding linguistic terms for evaluation

| Linguistic term   | Abbrev. | Fuzzy scales    |
|-------------------|---------|-----------------|
| None              | N       | (0,1;0,1;1,0)   |
| Very low          | VL      | (0,0;0,1;0,2)   |
| Low               | L       | (0,1; 0,2; 0,3) |
| Fairly low        | FL      | (0,2; 0,3; 0,4) |
| More or less low  | ML      | (0,3; 0,4; 0,5) |
| Medium            | M       | (0,4; 0,5; 0,6) |
| More or less Good | MG      | (0,5; 0,6; 0,7) |
| Fairly Good       | FG      | (0,6; 0,7; 0,8) |
| Good              | G       | (0,7;0,8;0,9)   |
| Very Good         | VG      | (0,8; 0,9; 1,0) |
| Excelent          | Е       | (0,9; 1,0; 1,0) |

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Table 3.6.a Fuzzy DEMATEL and/or Fuzzy ANP and/or Fuzzy TOPSIS Integrated Methodology Literature Survey

| Author                         | Focus Area  | Utilised Integrated Methodology           |  |
|--------------------------------|---|---|--|
| Baykasoğlu et. al. (2013)      | Modeling and solving truck selection problem of a land transportation company                           | Fuzzy DEMATEL, Fuzzy Hierarchical TOPSIS  |  |
| Baykasoglu & Durmusoglu (2014) | Private primary school assessment   | DEMATEL, ANP, Fuzzy Cognitive Map         |  |
| Büyüközkan & Çifçi (2012)      | Evaluation of green suppliers   | Fuzzy DEMATEL, Fuzzy ANP, Fuzzy<br>TOPSIS |  |
| Chamzini et. al. (2014)        | Prioritising the investment strategies in the private sector  | DEMATEL, Fuzzy TOPSIS                     |  |
| Chen & Chen (2010)             | Innovation support system for Taiwanese higher education  | DEMATEL, Fuzzy ANP, TOPSIS                |  |
| Chiu et. al. (2013)            | Assessing and improving strategies to reduce the gaps in customer satisfaction                          | DEMATEL, ANP, VIKOR                       |  |
| Chyu & Fang (2014)             | New product development selection problem   | Fuzzy DEMATEL, Fuzzy ANP, Fuzzy Kano      |  |
| Dorri et. al. (2014)           | Selection of Repair & Maintenance strategy for IT systems   | DEMATEL, Fuzzy ANP                        |  |
| Govindana et. al. (2014)       | Evaluation of green manufacturing practices   | DEMATEL, ANP with PROMETHEE               |  |
| Hsu et. al. (2013)             | Selection of an outsourcing provider  | DEMATEL, ANP, Grey Relation               |  |
| Hsu (2012)                     | Best selection to conduct the recycled materials  | DEMATEL, ANP, VIKOR                       |  |
| Hu et. al. (2014)              | Exploring smart phone improvements based on a hybrid MCDM model   | DEMATEL, ANP, VIKOR                       |  |
| Huang et. al. (2011)           | Expatriate manager selection for an overseas manufacturing site   | DEMATEL, ANP, VIKOR                       |  |
| Huang et. al. (2012)           | Evaluating the impact derivations for integrated marketing communications on the high-technology brands | Fuzzy DEMATEL, ANP                        |  |

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Table 3.6.b Fuzzy DEMATEL Fuzzy ANP Fuzzy TOPSIS Integrated Methodology Literature Survey

| Author                  | Focus Area   | Utilised Integrated Methodology                    |  |
|-------------------------|--|--|--|
| Huang & Kao (2012)      | Analyzing the factors influencing the acceptance of padfones   | Fuzzy DEMATEL, ANP, Technology<br>Acceptance Model |  |
| Huang & Ting (2012)     | Derivations of factors influencing the word-of-mouth marketing strategies for smart phone applications   | Fuzzy DEMATEL, ANP                                 |  |
| Kuo & Liang (2011)      | Selecting locations in a fuzzy environment   | DEMATEL, Fuzzy ANP, TOPSIS                         |  |
| Le et. al. (2014)       | Cloud service selection  | Fuzzy TOPSIS, Fuzzy AHP                            |  |
| Lee et. al. (2011)      | This study aims to provide more efficient and effective investment decision making process.  | DEMATEL, ANP                                       |  |
| Liou et. al. (2011)     | Offering a quantitative decision model that can help practitioners to select outsourcing provider and reap the most benefits from outsourcing. | DEMATEL, ANP, Fuzzy Preference<br>Programming      |  |
| Lin et. al. (2010)      | Evaluating vehicle telematics system   | DEMATEL, ANP, TOPSIS                               |  |
| Liou & Chuang (2010)    | Selection of outsourcing providers   | DEMATEL, ANP, VIKOR                                |  |
| Liu et al. (2012)       | Improving tourism policy implementation  | DEMATEL, ANP, VIKOR                                |  |
| Liu et. al. (2013)      | Improving metro–airport connection service for tourism development   | DEMATEL, ANP, VIKOR                                |  |
| Liu et. al. (2014)      | Material selection with target based criteria  | DEMATEL, ANP, VIKOR                                |  |
| Lu et. al. (2013)       | Improving RFID adoption  | DEMATEL, ANP                                       |  |
| Peng & Tzeng (2012)     | Improvement of tourism competitiveness   | Fuzzy DEMATEL, ANP, VIKOR                          |  |
| Sangaiah et. al. (2014) | Evaluating global software development (GSD) project outcome factors   | Fuzzy DEMATEL, Fuzzy TOPSIS                        |  |
| Shen et. al.(2014)      | Glamor stock selection and stock performance improvement   | DEMATEL, ANP, VIKOR                                |  |

Table 3.6.c Fuzzy DEMATEL Fuzzy ANP Fuzzy TOPSIS Integrated Methodology Literature Survey

| Author                      | Focus Area   | Utilised Integrated Methodology          |  |  |
|-----------------------------|--|--|--|--|
| Sinrat & Atthirawong (2013) | Supplier selection based on supply chain risk management                                   | Fuzzy ANP, TOPSIS                        |  |  |
| Shen et. al. (2012)         | Glamour stock selection  | DEMATEL, ANP, TOPSIS                     |  |  |
| Su et. al. (2012)           | Improving cloud computing service with a new hybrid FMCDM model                            | Fuzzy DEMATEL, Fuzzy ANP, Fuzzy<br>VIKOR |  |  |
| Tsai et. al. (2010)         | Offering the priority of sourcing mode to execute Information Systems task in IT projects. | DEMATEL, ANP, ZOGP                       |  |  |
| Tsai et. al. (2011)         | An effectiveness evaluation model for the web-based marketing of the airline industry      | DEMATEL, ANP, VIKOR                      |  |  |
| Tsai & Kuo (2011)           | Entrepreneurship policy evaluation and decision analysis for SMEs                          | DEMATEL, ANP, ZOGP                       |  |  |
| Tabriz et. al. (2014)       | Solving of supplier selection problems   | Fuzzy DEMATEL-ANP-TOPSIS                 |  |  |
| Tadic' et. al. (2014)       | City logistics concept selection   | Fuzzy DEMATEL, Fuzzy ANP, Fuzzy VIKOR    |  |  |
| Tseng (2011)                | Evaluating firm environmental knowledge management in uncertainty                          | DEMATEL, ANP                             |  |  |
| Uygun et. al. (2013)        | Supplier selection for automotive industry   | DEMATEL, ANP, TOPSIS                     |  |  |
| Uygun et al. (2014)         | Evaluation and selection of outsourcing provider for a telecommunication company           | DEMATEL, Fuzzy ANP                       |  |  |
| Wang & Tzeng (2012)         | Brand marketing for creating brand value   | DEMATEL, ANP, VIKOR                      |  |  |
| Wu (2008)                   | Proposing companies that need to evaluate and select knowledge management strategies.      | DEMATEL, ANP                             |  |  |
| Yang et. al. (2013)         | Proposing an information security risk-control assessment model                            | DEMATEL, ANP, VIKOR                      |  |  |
| Zhou & Lu (2012)            | Risk evaluation of dynamic alliance to choose a coalition partner                          | Fuzzy ANP, Fuzzy TOPSIS                  |  |  |

**Step 3:** Establish causal relations within dimensions applying fuzzy DEMATEL (Wu & Lee, 2007).

**Step 3.1:** Obtain fuzzy direct-relation matrix. Experts are making sets of the pair wise comparisons of elements (dimensions and criteria), i.e., forming an nxn matrix  $\tilde{A}$  whose elements, triangular fuzzy numbers.

 $\tilde{a}_{ij} = (l_{ij}, m_{ij}, u_{ij})$ , represent the degree to which the element i affects the element j.

**Step 3.2:** Obtain normalized fuzzy direct-relation matrix  $\tilde{X}$  obtained from the matrix  $\tilde{A}$  by using the equation:

$$\tilde{X} = s \times \tilde{A} \tag{10}$$

where  $s = 1/\max_{l \le i \le n} \sum_{j=1}^{n} u_{ij}$  and  $\tilde{a}_{ij} = (l_{ij}, m_{ij}, u_{ij})$ .

**Step 3.3:** Obtain fuzzy total-relation matrix  $\tilde{T}$ . Let  $\tilde{x}_{ij} = (l_{ij}, m_{ij}, u_{ij})$  be the element of matrix  $\tilde{X}$ . It is necessary to define three crisp matrices whose elements are extracted from  $\tilde{X}$  as follows:

$$X_{l} = \begin{bmatrix} 0 & l_{12} & \cdots & l_{1n} \\ l_{21} & 0 & \cdots & l_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ l_{n1} & l_{n2} & \cdots & 0 \end{bmatrix} \qquad X_{m} = \begin{bmatrix} 0 & m_{12} & \cdots & m_{1n} \\ m_{21} & 0 & \cdots & m_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ m_{n1} & m_{n2} & \cdots & 0 \end{bmatrix}$$

$$Xu = \begin{bmatrix} 0 & u_{12} & \cdots & u_{1n} \\ u_{21} & 0 & \cdots & u_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ u_{n1} & u_{n2} & \cdots & 0 \end{bmatrix}$$

Fuzzy total-relation matrix  $\tilde{T}$  is obtaining using the following equation:

$$\tilde{T} = \tilde{X} (I - \tilde{X})^{-1}. \tag{11}$$

Let 
$$\tilde{T} = \begin{bmatrix} \tilde{t}_{11} & \tilde{t}_{12} & \cdots & \tilde{t}_{1n} \\ \tilde{t}_{21} & \tilde{t}_{22} & \cdots & \tilde{t}_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ \tilde{t}_{n1} & \tilde{t}_{n2} & \cdots & \tilde{t}_{nn} \end{bmatrix}$$

Where  $\tilde{t}_{ij} = (l_{ij}, m_{ij}, u_{ij})$  then

Matrix 
$$[l_{ij}] = X_l (I - X_l)^{-1}$$
, (12)

Matrix 
$$[m_{ij}] = X_m (I - X_m)^{-1},$$
 (13)

Matrix 
$$[u_{ij}] = X_u (I - X_u)^{-1}$$
. (14)

where I is the identity matrix ( $n \times n$  square matrix with ones on the main diagonal).

**Step 3.4:** Obtain inner dependence matrix. In order to obtain the values of inner dependence between the elements within the same cluster, elements of matrix  $\tilde{T}$  are being defuzzyfied using the following equation.

$$F(\widetilde{t}_{ij}) = 1/2 \int_{0}^{1} \left( \inf_{x \in \Re} \widetilde{t}_{ij}^{\alpha} + \sup_{x \in \Re} \widetilde{t}_{ij}^{\alpha} \right) d\alpha$$
 (15)

**Step 4:** Establish remaining relations using the fuzzy ANP. Those are the relations between the elements from different clusters. In ANP, pair wise comparisons of the elements in each cluster are conducted with respect to their relative importance towards their control criterion. By using triangular fuzzy numbers again, the relative strength, i.e., the preference of each element in relation to other elements is evaluated. Via pair wise comparison, the fuzzy judgment matrix  $\tilde{A}$  is constructed as:

$$\tilde{A} = \begin{bmatrix} \tilde{a'}_{11} & \tilde{a'}_{12} & \cdots & \tilde{a'}_{1n} \\ \tilde{a'}_{21} & \tilde{a'}_{22} & \cdots & \tilde{a'}_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ \tilde{a'}_{n1} & \tilde{a'}_{n2} & \cdots & \tilde{a'}_{nn} \end{bmatrix}$$
(16)

where  $\widetilde{a}'_{ij} = (l_{ij}, m_{ij}, u_{ij})$  indicates the importance of element i over element j, and i = j = 1, 2, ..., n.

**Step 5:** Estimate triangular fuzzy priorities  $\tilde{w}_k$  where i = 1, 2, ..., n from the judgment matrix. The logarithmic least-squares method in (16) can be used for calculating these weights:

$$\tilde{w}_{k} = (w_{k}^{l}, w_{k}^{m}, w_{m}^{u}) \text{ k} = 1, 2, ..., \text{n where}$$

$$w_{k}^{s} = \frac{\left(\prod_{i=1}^{n} a_{kj}^{s}\right)^{1/n}}{\sum_{i=1}^{n} \left(\prod_{i=1}^{n} a_{ij}^{m}\right)^{1/n}} \quad , s \in \{l, m, u\}$$
(17)

for  $0 < \alpha \le 1$  and all i, j, where  $i = 1, 2 \dots n, j = 1, 2 \dots n$ .

In order to control the result of the method, we calculate the Consistency Ratio (*CR*) for each matrix as follows (Saaty, 1996):

$$CR = CI/RI$$
 (18)

where CI is the Consistency Index and is calculated as follows:

$$CI = \frac{\lambda_{\max - n}}{n - 1} \tag{19}$$

 $\lambda_{max}$  is the Perron root or principal eigenvalue of the matrix  $\tilde{A}$  (Forman, 1990). RI is the Random Index whose values for matrices of various sizes are contained in Saaty (1996). We use CR to directly estimate the consistency of the pair wise comparisons and should be less than 0.10. Then we can say the comparisons are acceptable.

**Step 6:** Form a supermatrix (W). ANP uses the formation of a supermatrix to allow for the resolution of the effects of the interdependence between the elements of the network structure. The supermatrix is a partitioned matrix where each submatrix is composed of a set of quantified relations between the elements from the same or different clusters. General representation of the supermatrix hierarchy (W) with three levels is as follows:

$$W = \begin{array}{c} \text{Goal (G)} \\ W = \\ \text{Alternatives (A)} \end{array} \begin{pmatrix} 0 & 0 & 0 \\ W_{21} & W_{22} & 0 \\ 0 & W_{32} & I \end{pmatrix} \tag{20}$$

where the influence of the goal on the attribute is represented by vector  $W_{21}$ , the mutual influence among criteria is represented by vector  $W_{22}$ , the influence of the attribute on each of the alternatives is represented by vector  $W_{32}$ , and I is the identity matrix (Saaty & Takizawa, 1986).

**Step 6.1:** Obtain the limit supermatrix. Raising the supermatrix to the power 2p + 1, where p is a sufficiently large number, the matrix is converging, i.e., the row values of

the matrix are converging to the same values for every column of the matrix (Lee et. al. 2009). We call the obtained matrix as the limit supermatrix.

**Step 7:** Evaluate the alternatives by using fuzzy TOPSIS. The procedure is adapted from Chen (2000), and computational steps are described below.

**Step 7.1:** Establish fuzzy decision matrix for alternatives.

$$\widetilde{D} = \begin{bmatrix} A_1 & \widetilde{\chi}_{11} & \widetilde{\chi}_{12} & \cdots & \widetilde{\chi}_{1n} \\ \vdots & \vdots & \vdots & \vdots \\ A_m & \widetilde{\chi}_{m1} & \widetilde{\chi}_{m2} & \cdots & \widetilde{\chi}_{mn} \end{bmatrix}$$

 $\widetilde{D}$  represents the fuzzy decision matrix with alternatives A and criteria C.

**Step 7.2:** Normalize the decision matrix. Normalized fuzzy decision matrix  $\widetilde{R}$  is calculated as:

$$\widetilde{R} = [r_{ij}]_{mxn}$$
 ,  $i = 1, ..., m$   $j = 1, ..., n$ 

$$\tilde{r}_{ij} = \left(\frac{a_{ij}}{c_j^+}, \frac{a_{ij}}{c_j^+}, \frac{a_{ij}}{c_j^+}\right),\tag{21}$$

where  $C_j^+ = \max_i C_{ij}$ . To avoid the complicated normalization Formula used in the classical TOPSIS, the linear scale transformation is used to transform the various criteria scales into a comparable scale (Chen, 2000). Linear scale transformation for normalization is also employed by Kuo et al. (2007) and Celik et al. (2009). Here normalized decision matrix remains the same because maxCij=1.

**Step 7.3:** Compute weighted decision matrix. Weighted normalized fuzzy decision matrix is computed where  $w_i$  is the weight for the criterion j obtained from supermatrix.

$$\widetilde{v}_{ij} = \widetilde{r}_{ij} x \widetilde{w}_j$$
, where  $\widetilde{v} = [v_{ij}]_{mxn}$ ,  $i=1,...,m$   $j=1,...,n$ 

**Step 7.4:** Calculate the distances from positive and negative ideal points. Since the triangular fuzzy numbers are included in [0,1] range, positive and negative ideal reference points (FPIRP, FNIRP) are as follows:

$$A^{+} = \{ V_{1}^{+}, V_{2}^{+}, \dots, V_{n}^{+} \}$$
 (23)

where  $V_j^+ = (1,1,1) \ V_j^- = (0,0,0)$ 

The next step is to calculate the distance of alternatives from FPIRP and FNIRP.

$$d_i^+ = \sum_{j=1}^n d(\tilde{v}_{ij}, \tilde{v}_j^+) \quad , i=1,...,m \quad j=1,...,n$$
 (24)

$$d_i^- = \sum_{j=1}^n d(\tilde{v}_{ij}, \tilde{v}_j^-) \quad , i=1,...,m \quad j=1,...,n$$
 (25)

$$d(\tilde{A}, \tilde{B}) = \sqrt{\frac{1}{3} (a_1 - b_1)^2 + (a_2 - b_2)^2 + (a_3 - b_3)^2}$$
(26)

**Step 7.5:** Rank the alternatives. The performance indices are computed to rank the alternatives. Performance indices are sorted in a decreasing order.

The steps of proposed hybrid MCDM model is also shown in Figure 3.2,

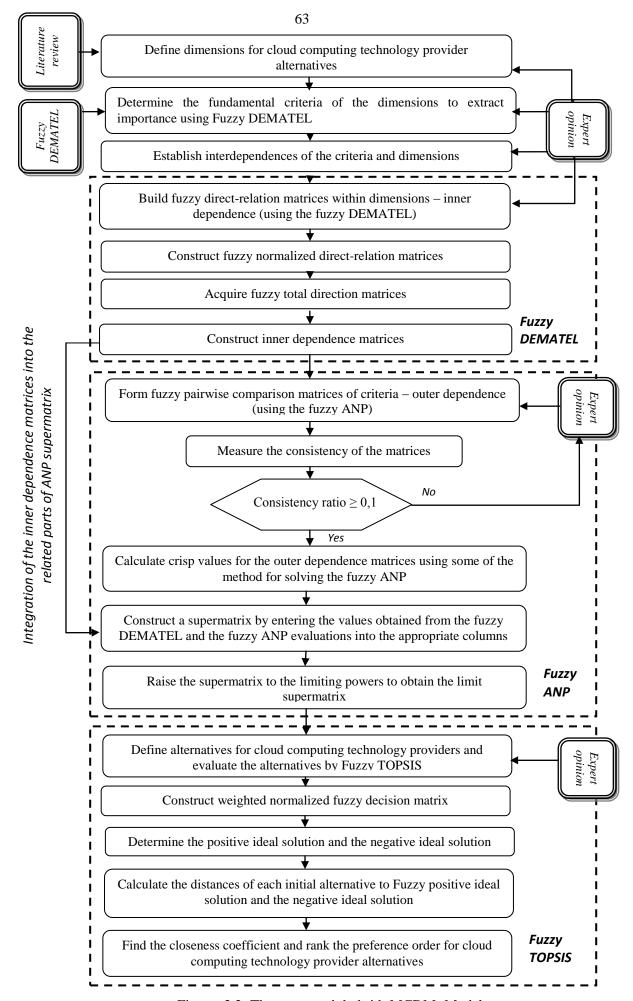


Figure 3.2 The proposed hybrid MCDM Model

### 4. APPLICATION OF THE PROPOSED METHODOLOGY

The methodology mentioned in the previous sections is applied in a real case study (Buyukozkan & Maden, 2015).

### 4.1 PURIFICATION OF THE EVALUATION CRITERIA

Through an intensive literature review, this thesis has managed to extract criteria influencing the cloud computing technology provider evaluation process. The complexity of the criteria was easier to discover using a visible casual diagram. Through analyzing and discussing the structural model, we figured out which factors are of more fundamental importance for the system, and which are not. Therefore, a set of complex criteria under different dimensions can be divided into a cause group and an effect group considering the interdependence among criteria. Then according to the results of fuzzy DEMATEL method, essential criteria for functionality dimension are figured out based upon the consensus of experts and academics. Finally, 6 criteria are identified under Functionality dimension out of 16 criteria under management services, capacity part, physical property part and service quality dimensions as shown in Figure 4.1-4.4.

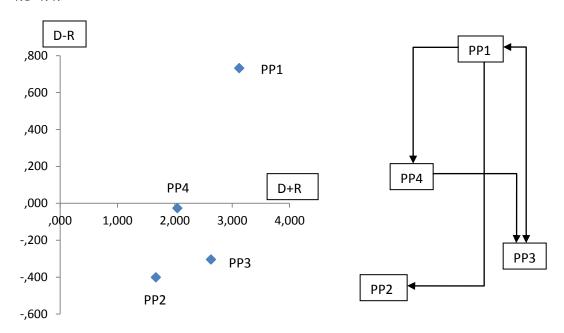


Figure 4.1 Cause and effect diagram for physical property part dimension

In view of the physical property dimension, communication is the most important criterion in terms of positive (D+R) and (D-R) values. Computation criterion is directly affected by communication criterion but it doesn't influence other criteria. The communication criterion is assumed to have higher priority and is called cause criterion. And those computation, storage and memory criteria are receiving more influence from another so they are assumed to have lower priority and are called effect criteria.

Fig. 4.2 depicts that availability affects transaction speed, latency, reliability and influenced by reliability criterion. The criterion with larger (D+R) value represents higher importance under the same dimension. Transaction speed has no impact on the others and it is relatively unimportant in terms of smaller (D+R) values, and improving this criteria doesn't receive positive impacts on availability, transaction speed and latency from cause-effect viewpoints. Availability and reliability are the most important criteria since they dispatche the influence to other evaluation criteria more than they receive, and they receive the influence from other evaluation criteria more than they dispatch.

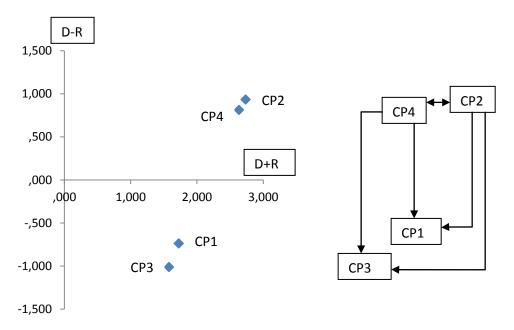


Figure 4.2 Cause and effect diagram for capacity part dimension

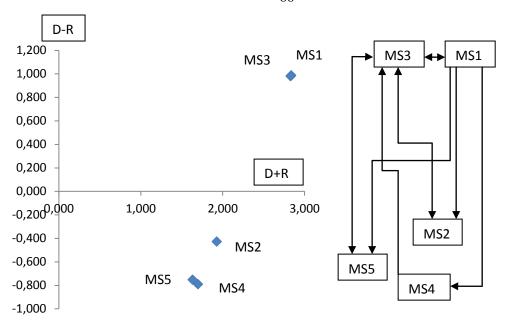


Figure 4.3 Cause and effect diagram for management services dimension

Fig. 4.3 depicts that deployment and billing are the two essential criteria though these two criteria are influenced by each other or other criteria. In addition, deployment is slightly more important than billing in terms of positive (D+R) values.

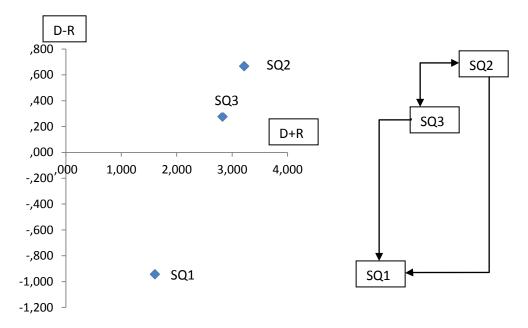


Figure 4.4 Cause and effect diagram for service quality

Enrich content and service stability are critical criteria so they should be evaluated first by the suppliers. Service stability is more important than enrich content in terms of positive (D+R) values. Service stability is the most essential criterion based on Figure

4.4, since this criterion affects the other two criteria. In view of the service quality dimension, service stability is the most important dimension followed by enrich content and SLA Management.

### 4.2 CASE STUDY

After demonstrating the proposed framework, a case study was applied of a company in Turkey. The case company ABC faced the difficulties of choosing an efficient cloud computing technology provider and spent a lot of time on this issue. To meet the needs of customer BlogTO.com, a popular site in Toronto, the company aggregated the assessments of our proposed framework with their current status of the factors that affecting the selection process of the appropriate cloud computing technology provider. The company indicates that confidentiality, integrity, multi-tenant trust and availability are the most important criteria of achieving cloud security in the case cloud computing services. Especially integrity criterion represents higher importance among them. Multi-tenant trust is critically important in terms of authorization related issues. When evaluating cloud security dimension, the impact of auditability would be disregarded.

For the development of cost-efficient processes and accomplishment of faster responses to the changes, flexibility cost that covers the further IT infrastructure changes is the most critical criteria among cost related factors. For a sufficient pyhsical property part, it is recommended to involve communication criteria as for free in the same domain. It is also suggested to disregard storage criterion on account of provider's infinite storage capacity. In addition to availability criterion, the reliability of a system for the proper high quality capacity part is also an essential factor; so it is suggested to focus on these criteria to increase the efficiency of customer's performance when deploying cloud computing technology. It is recommended not to pay much attention to the latency (time) criterion which they often choose the closest measure of time delay for intended performance in capacity part of cloud computing technology provider. The importance of deployment is due to automated processes to reduce the burden across cloud deployment. For that, the other suggested criteria are deployment and billing when considering the management services dimension. With regard to obtained reviews about

their own processes, configuration and monitoring can be disregarded because their system have already had these characteristics in their company.

A new criteria could be added or deleted from our proposed framework, on the basis of experiences of the experts and deep knowledge of academics. In addition to distractions and combinations of criteria from our proposed framework, two new criteria were being added in vendor related dimension as documentation and trustworthiness of the provider. We can judge a provider or the organization with its trustworthiness and reputation. Indicators like number of customers might be partly measurable, but we should consider a qalitative evaluation framework. Documentation refers to the quality of documents or reference materials related to the cloud computing technology that the vendor provides to guide the users as to how to set up, operate, and customize the software. "The availability of documentation is important, including technical documentation".

In the service quality dimension, the experts consider service stability to be the most important criterion. When selecting the best cloud provider for the given application, experts believe that vendor's reputation is the most important criteria in the vendor related dimension. The customers are also suggested to be careful about the brand value of the vendor, the experience of current cloud service users and the threats resulted from misguidance of cloud services. As another recommendation, proper documentation is essential for short time cloud deployment processes. After adapting the DEMATEL procedures to determine the degrees of influence of the criteria, the ANP method is used to calculate the weight of each criterion and apply these to normalize the unweighted supermatrix in the ANP to demonstrate proposed framework in a series of pairwise comparisons.

**Step 1:** Determination of the evaluation model. The set of dimensions for their evaluation was reviewed, and then the set of criteria were defined. Our proposed criteria framework for cloud computing technology service provider selection was developed based on the broad literature review including seven dimensions as cloud security, cost, physical property part, capacity part, vendor related, cloud security, management services, service quality. These surveys helped us to classify the various decision-

making criteria into different dimensions avoiding the shortcomings of classic outsourcing decisions where cost alone is used as the deciding factor. With regard to obtained assessments of the experts for the processes of case company ABC and in light of our proposed criteria framework, the final dimensions were determined as cloud security, cost, functionality and vendor related. In view of these assessments, we classified the criteria of communication, availability, reliability, service stability, deployment and billing under the functionality dimension disregarding the separateness of particular service quality, management services, physical propert part and capacity part dimensions. And the experts specifically focused on the vendor related dimension which must be evaluated with documentation, R&D capability, trustworthiness of the provider and community support criteria in addition to experience in related products and vendor's experience criteria. Using the assessments of the experts in light of our reviewed criteria framework, graphical representation of the relationships among the dimensions are shown in Figure 4.5,

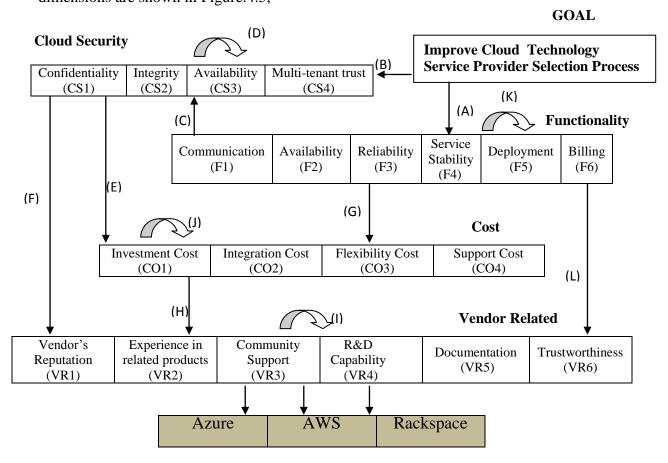


Figure 4.5 Graphical framework of the proposed dimensions

The arrows in the model indicate a one or two-way relationship and the interdependency relationship of dimensions is shown by a looped arc and calculated using fuzzy DEMATEL. The capital letters from A to J in parentheses represent the weight matrices used in the supermatrix. General sub-matrix for supermatrix is shown in Figure 4.2.,

|                     | Goal | CO | CS | F | VR |
|---------------------|------|----|----|---|----|
| Goal                | 0    | 0  | 0  | 0 | 0  |
| Cost (CO)           | 0    | J  | Е  | G | 0  |
| Cloud Security (CS) | В    | 0  | D  | 0 | 0  |
| Functionality (F)   | A    | 0  | 0  | K | 0  |
| Vendor Related (VR) | 0    | Н  | F  | L | I  |

Figure 4.6 General sub-matrix notation for supermatrix.

**Step 2:** Relationships among the structure's elements were defined using experts' opinions and academics' knowledge through paired comparison. Four dimensions and twenty criteria are used in this study. Since there are four dimensions, the seven 4x4 fuzzy direct-relation matrix A,

Table 4.1 Initial linguistic direct relation matrix

|    | CS | CO | F  | VR |
|----|----|----|----|----|
| CS | 0  | G  | M  | VG |
| CO | FG | 0  | MG | VL |
| F  | VL | VL | 0  | MG |
| VR | VG | VG | FG | 0  |

Table 4.2 Initial fuzzy direct relation matrix

| ·  | CS            | CO            | F               | VR            |
|----|---------------|---------------|-----------------|---------------|
| CS | 0             | (0,7;0,8;0,9) | (0,4; 0,5; 0,6) | (0,8; 0,9; 1) |
| CO | (0,6;0,7;0,8) | 0             | (0,5;0,6;0,7)   | (0; 0,1; 0,2) |
| F  | (0; 0,1; 0,2) | (0; 0,1; 0,2) | 0               | (0,5;0,6;0,7) |
| VR | (0,8; 0,9; 1) | (0,8;0,9;1)   | (0,6;0,7;0,8)   | 0             |

**Step 3:** Causal relations were established within dimensions applying fuzzy DEMATEL.

Table 4.3 The normalized direct-relation matrix X

|    | CS   | CO   | F    | VR   |
|----|------|------|------|------|
| CS | 0,00 | 0,32 | 0,17 | 0,36 |
| CO | 0,28 | 0,00 | 0,22 | 0,04 |
| F  | 0,04 | 0,04 | 0,00 | 0,22 |
| VR | 0,36 | 0,36 | 0,28 | 0,00 |

In Step 3, Matrix T can be computed by the following formula T=X.(I-X)<sup>-1</sup>,

Table 4.4 Total relation matrix of the dimensions

|    | CS   | СО   | F    | VR   |
|----|------|------|------|------|
| CS | 0,50 | 0,76 | 0,63 | 0,71 |
| CO | 0,52 | 0,31 | 0,48 | 0,35 |
| F  | 0,26 | 0,27 | 0,21 | 0,38 |
| VR | 0,80 | 0,82 | 0,74 | 0,49 |

The importance of dimensions can be determined by the (D+R) values. Table 4.5 shows that Vendor related is the most important dimension with the largest (D+R) value of -4,76 whereas Functionality is the least important dimension with the smallest value.

Table 4.5 Row and column values among dimensions.

|    | D+R  | D-R   |
|----|------|-------|
| CS | 4,67 | 0,52  |
| CO | 3,82 | -0,51 |
| F  | 3,19 | -0,94 |
| VR | 4,76 | 0,92  |

Table 4.6 Row and column values for the criteria in the various dimensions

| Dimension        | Criteria                              | D    | R    | D+R   | D-R   |
|------------------|---------------------------------------|------|------|-------|-------|
| Cloud Security   | (CS1) Confidentiality                 | 6,46 | 6,14 | 12,60 | 0,32  |
|                  | (CS2) Integrity                       | 6,54 | 6,30 | 12,84 | 0,24  |
|                  | (CS3) Availability                    | 4,64 | 5,26 | 9,91  | -0,62 |
|                  | (CS4) Multi-tenant trust              | 5,26 | 5,21 | 10,47 | 0,06  |
| Cost             | (CO1) Investment Cost                 | 1,03 | 1,97 | 3,00  | -0,94 |
|                  | (CO2) Integration Cost                | 1,24 | 1,98 | 3,22  | -0,74 |
|                  | (CO3) Flexibility Cost                | 2,66 | 1,76 | 4,42  | 0,90  |
|                  | (CO4) Support Cost                    | 2,67 | 1,89 | 4,56  | 0,77  |
| Functionality    | (F1) Communication                    | 7,36 | 7,24 | 14,60 | 0,12  |
| 1 01100101111110 | (F2) Availability                     | 6,34 | 6,20 | 12,54 | 0,14  |
|                  | (F3) Reliability                      | 6,41 | 5,20 | 11,60 | 1,21  |
|                  | (F4) Service Stability                | 6,08 | 5,54 | 11,62 | 0,54  |
|                  | (F5) Deployment                       | 7,03 | 6,80 | 13,83 | 0,23  |
|                  | (F6) Billing                          | 4,22 | 6,45 | 10,67 | -2,23 |
| Vendor Related   | (VR1) Vendor's Reputation             | 5,81 | 5,60 | 11,41 | 0,21  |
|                  | (VR2) Experience in related products  | 4,99 | 5,86 | 10,85 | -0,87 |
|                  | (VR3) Community Support               | 4,36 | 4,52 | 8,88  | -0,17 |
|                  | (VR4) R&D Capability                  | 4,38 | 4,19 | 8,57  | 0,18  |
|                  | (VR5) Documentation                   | 5,59 | 4,29 | 9,88  | 1,29  |
|                  | (VR6) Trustworthiness of the provider | 4,60 | 5,26 | 9,87  | -0,65 |

To further investigate the cause-effect relationship of dimensions, cloud security and vendor related are net causes based on positive (D-R) values. Cost and functionality are net receivers due to negative (D-R) values.

In this study, the threshold value is set up by computing the average of the elements in Matrix T (Total Relation Matrix) to obtain the digraph. In doing so, only the effects greater than the threshold value would be chosen and shown in digraph.

Figures 4.7-4.10 describe the causal relations among the criteria under the dimensions of cost, cloud security, vendor related and functionality.

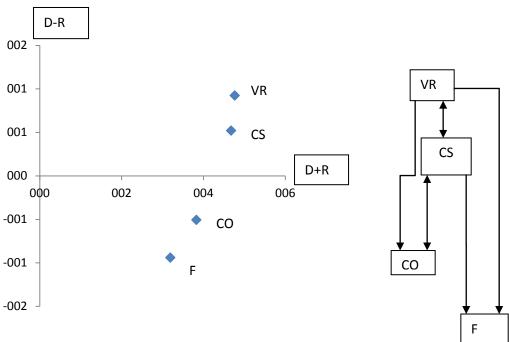


Figure 4.7 Cause and effect diagram for dimensions

Vendor related and cloud security are critical dimensions so they should be evaluated first by the suppliers when considering the application study. Vendor related is more important than cloud security in terms of positive (D+R) values. These are essential dimensions based on Figure. 4.3 since they affect the other three dimensions. In view of the general dimensions, vendor related is the most important dimension followed by cloud security, cost and functionality.

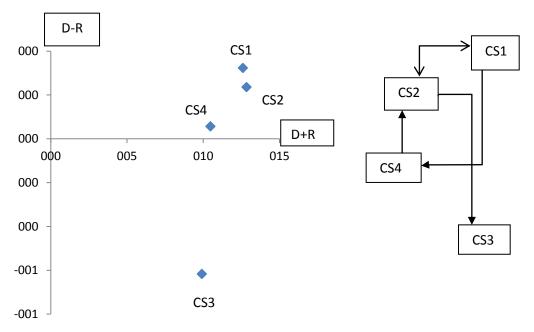


Figure 4.8 Cause and effect diagram for cloud security dimension

To choose a right cloud computing technology provider alternative, cloud security dimension is the mostly evaluated critical dimension used by both practitioners and academics in their related studies. For that, our application study focused especially two criteria as integrity and confidentiality. Integrity criterion is slightly more important than confidentiality criterion in view of positive D+R values.

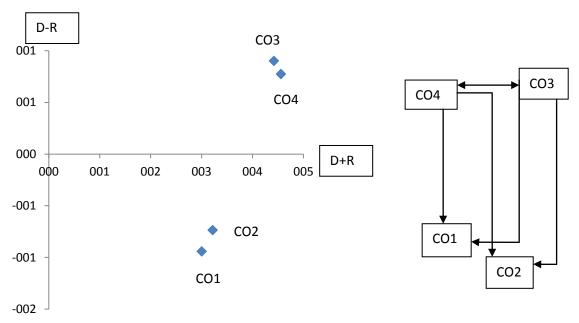
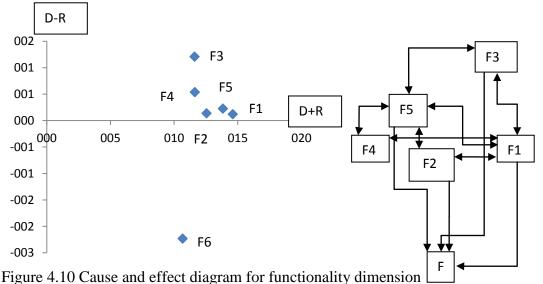


Figure 4.9 Cause and effect diagram for cost dimension

When considering cost dimension, two critical criteria as support cost and flexibility must be first evaluated both by customers and providers for healty and cost-effective processes. Support cost is more important than flexibility cost considering higher D+R.



When evaluating functionality dimension; communication, deployment, availability, reliability and service stability are the most critical criteria that focusing positive D-R values and positive D+R values. These are the criteria that must be first improved by providers and they help giving efficient way for customers to make healty decisions.

Fuzzy evaluation matrixes of cloud security, cost, functionality and vendor related dimensions are given in Table 4.7 and in Table 4.15,

Table 4.7 Linguistic evaluation matrix of cloud security

|     | CS1 | CS2 | CS3 | CS4 |
|-----|-----|-----|-----|-----|
| CS1 | 0   | G   | VL  | VG  |
| CS2 | VG  | 0   | VG  | VL  |
| CS3 | FG  | VL  | 0   | M   |
| CS4 | VL  | VG  | M   | 0   |

Table 4.8 Fuzzy evaluation matrix of cloud security

|     | CS1           | CS2           | CS3           | CS4           |
|-----|---------------|---------------|---------------|---------------|
| CS1 | 0             | (0,7;0,8;0,9) | (0; 0,1; 0,2) | (0,8;0,9;1)   |
| CS2 | (0,8;0,9;1)   | 0             | (0,8;0,9;1)   | (0; 0,1; 0,2) |
| CS3 | (0,6;0,7;0,8) | (0; 0,1; 0,2) | 0             | (0,4;0,5;0,6) |
| CS4 | (0; 0,1; 0,2) | (0,8;0,9;1)   | (0,4;0,5;0,6) | 0             |

Table 4.9 Linguistic evaluation matrix of functionality

|    | F1 | F2 | F3 | F4 | F5 | F6 |
|----|----|----|----|----|----|----|
| F1 | 0  | VG | FG | VG | FG | VL |
| F2 | FG | 0  | VL | MG | FG | VG |
| F3 | VG | FL | 0  | VL | VG | FL |
| F4 | ML | ML | ML | 0  | G  | ML |
| F5 | VL | VG | VG | FG | 0  | FL |
| F6 | VG | MG | VL | VL | VL | 0  |

Table 4.10 Fuzzy evaluation matrix of functionality

|    | F1            | F2              | F3              | F4              | F5              | F6            |
|----|---------------|-----------------|-----------------|-----------------|-----------------|---------------|
| F1 | 0             | (0,8; 0,9; 1,0) | (0,6; 0,7; 0,8) | (0,8; 0,9; 1,0) | (0,6; 0,7; 0,8) | (0; 0,1; 0,2) |
| F2 | (0,6;0,7,0,8) | 0               | (0; 0,1; 0,2)   | (0,5;0,6;0,7)   | (0,6;0,7;0,8)   | (0,8;0,9;1,0) |
| F3 | (0,8;0,9;1,0) | (0,2;0,3;0,4)   | 0               | (0; 0,1; 0,2)   | (0,8;0,9;1,0)   | (0,2;0,3;0,4) |
| F4 | (0,3;0,4;0,5) | (0,3;0,4;0,5)   | (0,3;0,4;0,5)   | 0               | (0,7;0,8;0,9)   | (0,3;0,4;0,5) |
| F5 | (0; 0,1; 0,2) | (0,8;0,9;1,0)   | (0,8;0,9;1,0)   | (0,6;0,7;0,8)   | 0               | (0,2;0,3;0,4) |
| F6 | (0,8;0,9;1,0) | (0,5;0,6;0,7)   | (0; 0,1; 0,2)   | (0; 0,1; 0,2)   | (0; 0,1; 0,2)   | 0             |

Table 4.11 Fuzzy evaluation matrix of cost

|     | CO1 | CO2 | CO3 | CO4 |
|-----|-----|-----|-----|-----|
| CO1 | 0   | VL  | MG  | VL  |
| CO2 | VL  | 0   | VL  | FG  |
| CO3 | VG  | G   | 0   | VG  |
| CO4 | G   | VG  | VG  | 0   |

Table 4.12 Fuzzy evaluation matrix of cost

|     | CO1           | CO2           | CO3           | CO4           |
|-----|---------------|---------------|---------------|---------------|
| CO1 | 0             | (0; 0,1; 0,2) | (0,5;0,6;0,7) | (0; 0,1; 0,2) |
| CO2 | (0; 0,1; 0,2) | 0             | (0; 0,1; 0,2) | (0,6;0,7;0,8) |
| CO3 | (0,8;0,9;1)   | (0,7;0,8;0,9) | 0             | (0,8;0,9;1)   |
| CO4 | (0,7;0,8;0,9) | (0,8;0,9;1)   | (0,8;0,9;1)   | 0             |

Table 4.13 Linguistic evaluation matrix of vendor related

|     | VR1 | VR2 | VR3 | VR4 | VR5 | VR6 |
|-----|-----|-----|-----|-----|-----|-----|
| VR1 | 0   | VG  | MG  | VL  | VG  | VL  |
| VR2 | MG  | 0   | ML  | MG  | ML  | MG  |
| VR3 | M   | VL  | 0   | ML  | ML  | ML  |
| VR4 | MG  | M   | VL  | 0   | VL  | L   |
| VR5 | VL  | M   | VG  | ML  | 0   | VG  |
| VR6 | VG  | M   | ML  | VG  | M   | 0   |

Table 4.14 Fuzzy evaluation matrix of vendor related

|     | VR1             | VR2             | VR3             | VR4             | VR5             | VR6             |
|-----|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| VR1 | 0               | (0,8; 0,9; 1,0) | (0,5; 0,6; 0,7) | (0; 0,1; 0,2)   | (0,8; 0,9; 1,0) | (0; 0,1; 0,2)   |
| VR2 | (0,5;0,6;0,7)   | 0               | (0,3;0,4;0,5)   | (0,5;0,6;0,7)   | (0,3; 0,4; 0,5) | (0,5;0,6;0,7)   |
| VR3 | (0,4;0,5;0,6)   | (0; 0,1; 0,2)   | 0               | (0,3;0,4;0,5)   | (0,3;0,4;0,5)   | (0,3;0,4;0,5)   |
| VR4 | (0,5;0,6;0,7)   | (0,4; 0,5; 0,6) | (0; 0,1; 0,2)   | 0               | (0; 0,1; 0,2)   | (0,1;0,2;0,3)   |
| VR5 | (0; 0,1; 0,2)   | (0,4;0,5;0,6)   | (0,8; 0,9; 1,0) | (0,3;0,4;0,5)   | 0               | (0,8; 0,9; 1,0) |
| VR6 | (0,8; 0,9; 1,0) | (0,4; 0,5; 0,6) | (0,3;0,4;0,5)   | (0,8; 0,9; 1,0) | (0,4; 0,5; 0,6) | 0               |

**Step 4:** Remaining relations were established using the fuzzy ANP and pair wise comparisons of the elements in each cluster were conducted with respect to their relative importance towards their control criterion.

**Step 5:** In order to control the result of the method, we calculated the Consistency Ratio *(CR)* for each matrix and the obtained consistency ratio *(CR)* values were all acceptable so the eigenvectors displayed were ready to enter into the supermatrix.

**Step 6:** We formed Supermatrix (W) and general representation of the supermatrix hierarchy (W). When entering the priorities found by fuzzy DEMATEL and fuzzy ANP into their related columns, initial supermatrix can be constructed as shown in Table 4.15

Normalization procedure is applied by transforming columns such that sum of each column is exactly 1. This new matrix is called weighted supermatrix. We took the power of the weighted supermatrix until the weights of the alternatives are stabilized.

After entering the normalized values, the limiting power of the weighted supermatrix is obtained indicating the weight of each alternative outsourcing provider. For our objective of improving cloud computing technology provider selection activites, weights of each criteria are identified to calculate in fuzzy TOPSIS later.

Table 4.15 Initial supermatrix (M) for selection of alternatives

|          |          |  | -       |               |                |         |               |          |            |       |              |         |          |        |       |       |       |       |       |       |       |
|----------|----------|--|---------|---------------|----------------|---------|---------------|----------|------------|-------|--------------|---------|----------|--------|-------|-------|-------|-------|-------|-------|-------|
|          | Goal     | CO1  | CO2     | CO3           | CO4            | CS1     | CS2           | CS3      | CS4        | F1    | F2           | F3      | F4       | F5     | F6    | VR1   | VR2   | VR3   | VR4   | VR5   | VR6   |
| Goal     | 0,000    | 0,000  | 0,000   | 0,000         | 0,000          | 0,000   | 0,000         | 0,000    | 0,000      | 0,000 | 0,000        | 0,000   | 0,000    | 0,000  | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CO1      | 0,000    | 0,103  | 0,122   | 0,199         | 0,125          | 0,595   | 0,596         | 0,596    | 0,587      | 0,000 | 0,000        | 0,000   | 0,000    | 0,000  | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CO2      | 0,000    | 0,143  | 0,125   | 0,151         | 0,235          | 0,270   | 0,284         | 0,284    | 0,311      | 0,000 | 0,000        | 0,000   | 0,000    | 0,000  | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CO3      | 0,000    | 0,383  | 0,370   | 0,253         | 0,386          | 0,075   | 0,087         | 0,087    | 0,089      | 0,000 | 0,000        | 0,000   | 0,000    | 0,000  | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CO4      | 0,000    | 0,371  | 0,383   | 0,397         | 0,253          | 0,060   | 0,066         | 0,066    | 0,067      | 0,000 | 0,000        | 0,000   | 0,000    | 0,000  | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CS1      | 0,519    | 0,000  | 0,000   | 0,000         | 0,000          | 0,248   | 0,303         | 0,268    | 0,311      | 0,564 | 0,564        | 0,564   | 0,564    | 0,564  | 0,459 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CS2      | 0,263    | 0,000  | 0,000   | 0,000         | 0,000          | 0,311   | 0,249         | 0,312    | 0,273      | 0,145 | 0,151        | 0,151   | 0,145    | 0,140  | 0,126 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CS3      | 0,173    | 0,000  | 0,000   | 0,000         | 0,000          | 0,221   | 0,194         | 0,174    | 0,220      | 0,162 | 0,156        | 0,150   | 0,156    | 0,161  | 0,162 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| CS4      | 0,063    | 0,000  | 0,000   | 0,000         | ρ,000          | 0,220   | 0,254         | 0,245    | 0,196      | 0,162 | 0,156        | 0,150   | 0,156    | 0,161  | 0,266 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| F1       | 0,100    | 0,000  | 0,000   | 0,000         | 0,000          | 0,000   | 0,000         | 0,000    | 0,000      | 0,173 | 0,207        | 0,209   | 0,215    | 0,202  | 0,182 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| F2       | 0,298    | 0,000  | 0,000   | 0,000         | <b>þ</b> ,000  | 0,000   | 0,000         | 0,000    | 0,000      | 0,173 | 0,151        | 0,157   | 0,177    | 0,173  | 0,182 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| F3       | 0,317    | 0,000  | 0,000   | 0,000         | 0,000          | 0,000   | 0,000         | 0,000    | 0,000      | 0,179 | 0,166        | 0,153   | 0,159    | 0,181  | 0,181 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| F4       | -        | -  | -       | -             | 1 '            | -       | -             | -        | -          | -     | -            |         | -        |        | -     | 0,000 | -     | -     | -     | -     | -     |
| F5       | ,        |  |         |               | 1 '            |         |               |          |            |       |              |         |          | ,      |       | 0,000 |       | ,     |       |       | -     |
| F6       |          |  |         |               |                |         |               |          |            | -     | -            | -       | -        |        | -     | 0,000 |       |       |       |       |       |
| VR1      | 0,000    | 0,197  | 0,197   | 0,203         | 0,203          | 0,203   | 0,208         | 0,208    | 0,208      | 0,208 | 0,208        | 0,208   | 0,208    | 0,208  | 0,208 | 1,000 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| VR2      | 0,000    | 0,133  | 0,133   | 0,134         | <b>\$</b> ,133 | 0,134   | 0,134         | 0,134    | 0,134      | 0,134 | 0,134        | 0,134   | 0,134    | 0,134  | 0,134 | 0,000 | 1,000 | 0,000 | 0,000 | 0,000 | 0,000 |
| VR3      | 0,000    | 0,194  | 0,197   | 0,198         | 0,198          | 0,198   | 0,198         | 0,203    | 0,207      | 0,207 | 0,207        | 0,207   | 0,207    | 0,207  | 0,207 | 0,000 | 0,000 | 1,000 | 0,000 | 0,000 | 0,000 |
| VR4      | -        | -  | -       | -             | 1.             | -       | -             | -        | -          | -     | -            | -       | -        | -      | -     | 0,000 | -     | -     | -     | -     |       |
| VR5      | 0,000    | 0,139  | 0,139   | 0,139         | d,139          | 0,145   | 0,145         | 0,145    | 0,142      | 0,151 | 0,154        | 0,154   | 0,150    | 0,154  | 0,160 | 0,000 | 0,000 | 0,000 | 0,000 | 1,000 | 0,000 |
| VR6      | 0,000    | _0,185   | 0,181   | 0,181         | 0,177          | 0,177   | 0,177         | 0,173    | 0,175      | 0,176 | _0,172       | _0,167  | 0,167    | 0,167  | 0,167 | 0,000 | 0,000 | 0,000 | 0,000 | 0,000 | 1,000 |
|          |          |  |         |               | \              |         |               |          |            |       |              |         |          |        |       |       |       |       |       |       |       |
|          |          | CS1  | CS2 (   | CS3 C         | S4             |         |               |          |            | CS1   | CS2          | CS3     | CS4      |        |       |       |       |       |       |       |       |
| X=       | 001      |  |         |               |                |         |               |          | CC1        |       |              |         |          |        |       |       |       |       |       |       |       |
|          | CS1      |  | <i></i> | ,06 0,        | 1              | 37.7T   | <b>x</b> z>-1 |          |            | 1,52  | 1,91         | 1,41    | 1,62     |        |       |       |       |       |       |       |       |
|          | CS2      | ,  | 0,00 0  | ,47 0,        | 06   1         | `=X.(I- | (X) =         |          | CS2        | 1,91  | 1,57         | 1,64    | 1,42     |        |       |       |       |       |       |       |       |
|          | CS3      | 0,37   | 0,06 0  | ,00 0,        | 23             |         |               |          | CS3        | 1,36  | 1,22         | 0,92    | 1,15     |        |       |       |       |       |       |       |       |
|          | CS4      | 0,06   | 0,47 0  | ,23 0,        | 00 ₩           |         |               |          | CS4        | 1,35  | <b>1</b> ,60 | 1 29    | 1,02     |        |       |       |       |       |       |       |       |
|          |          | <del>/                                    </del> |         |               | CS2 C          | S3 CS4  | _             |          | 0.0.1      |       | (1,00        | 1,22    | 1,02     |        |       |       |       |       |       |       |       |
|          |          |  | CS      | 1 0,19        |                |         | _             |          |            |       | \_           |         |          |        |       |       |       |       |       |       |       |
|          | (1)      | ·  | \       | 2 0,34        |                |         |               |          |            |       |              |         |          |        |       |       |       |       |       |       |       |
| Fuzzy N  | formaliz | zed  | ١       | <b>3</b> 0,28 |                |         |               |          |            |       | / T          | otal Re | lation N | Matrix |       |       |       |       |       |       |       |
| Direct R | elation  | Matrix   | 1       | <b>4</b> 0,19 |                |         | · ( /         |          | (3)        |       | $\checkmark$ |         |          |        | )     |       |       |       |       |       |       |
|          |          |  | / "     |               | -, 0,          | ,       | - /           | Normal   |            | ntal  |              |         | (2)      |        |       |       |       |       |       |       |       |
|          |          |  |         |               |                |         |               | Relation |            |       |              | _       |          |        |       |       |       |       |       |       |       |
|          |          |  |         |               |                |         |               | ixciano  | ıı ıvıaılı | Λ     |              | _       |          |        |       |       |       |       |       |       |       |
|          |          |  |         |               |                |         | \             |          |            |       |              |         |          |        |       |       |       |       |       |       |       |

In our application study, we raised the supermatrix to the power 51.

Table 4.16 Weighted supermatrix for cloud technology provider alternatives

|     | Goal | CO1  | CO2  | CO3  | CO4  | CS1  | CS2  | CS3  | CS4  | F1   | F2   | F3   | F4   | F5   | F6   |
|-----|------|------|------|------|------|------|------|------|------|------|------|------|------|------|------|
| VR1 | 0,20 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,20 | 0,20 | 0,20 | 0,20 | 0,20 | 0,20 | 0,20 | 0,20 | 0,20 |
| VR2 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 | 0,13 |
| VR3 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 | 0,19 |
| VR4 | 0,18 | 0,18 | 0,18 | 0,18 | 0,18 | 0,18 | 0,18 | 0,18 | 0,18 | 0,17 | 0,17 | 0,17 | 0,18 | 0,17 | 0,17 |
| VR5 | 0,14 | 0,13 | 0,13 | 0,13 | 0,13 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 | 0,14 |
| VR6 | 0,17 | 0,18 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 | 0,17 |

**Step 7:** Alternatives were evaluated by using fuzzy TOPSIS. Amazon Web Services provides a variety of cloud-based computing services including a wide selection of compute instances which can scale up and down automatically to meet the needs of your application, a managed load balancing service as well as fully managed desktops in the cloud. Amazon Web Services also provides low-cost data storage with high durability and availability. Pay-as-you-go pricing with no commitment means greater flexibility and agility. With AWS, high security is available at no extra cost. AWS offers storage choices for backup, archiving, and disaster recovery, as well as block, file, and object storage (aws.amazon.com).

With Azure Cloud Services, we can develop, package, and deploy powerful applications and services to the cloud. We can test our application before deploying to the cloud using the Azure Emulator, which brings the platform's key functionality right to our dev machine. Azure helps us to keep tabs on the health and available of your applications. The health metrics dashboard shows key stats at-a-glance on the health metrics dashboard (azure.microsoft.com).

Rackspace helps run our day-to-day cloud operations to provide proactive infrastructure monitoring, operating system maintenance and patching, application maintenance, and more all supported by a dedicated account team whose focus is understanding our business and helping it grow. Rackspace offers much more than infrastructure alone, because it takes much more than high-performance, reliable infrastructure to succeed in the cloud (rackspace.com).

Table 4.17 Linguistic decision matrix for provider evaluation

|           | VR1 | VR2 | VR3 | VR4 | VR5 | VR6 |
|-----------|-----|-----|-----|-----|-----|-----|
| Azure     | ML  | FL  | FL  | FL  | MG  | M   |
| AWS       | VG  | MG  | G   | MG  | VG  | M   |
| Rackspace | MG  | M   | MG  | ML  | G   | FL  |

Table 4.18 Fuzzy decision matrix for provider evaluation

|           | VR1             | VR2             | VR3             | VR4             | VR5             | VR6             |
|-----------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| Azure     | (0,3; 0,4; 0,5) | (0,2; 0,3; 0,4) | (0,2; 0,3; 0,4) | (0,4; 0,5; 0,6) | (0,2; 0,3; 0,4) | (0,5; 0,6; 0,7) |
| AWS       | (0,8; 0,9; 1,0) | (0,5; 0,6; 0,7) | (0,5;0,6;0,7)   | (0,4; 0,5; 0,6) | (0,7; 0,8; 0,9) | (0,8; 0,9; 1,0) |
| Rackspace | (0,5; 0,6; 0,7) | (0,4; 0,5; 0,6) | (0,3; 0,4; 0,5) | (0,2; 0,3; 0,4) | (0,5; 0,6; 0,7) | (0,7; 0,8; 0,9) |

Table 4.19 Weighted decision matrix for supplier alternative evaluation

|           | VR1                | VR2                | VR3                | VR4                | VR5                | VR6                |
|-----------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
| Azure     | (0,06; 0,08; 0,10) | (0,02; 0,30; 0,40) | (0,04; 0,06; 0,08) | (0,07; 0,09; 0,11) | (0,03; 0,04; 0,06) | (0,08; 0,10; 0,12) |
| AWS       | (0,16;0,18;1,20)   | (0,50;0,60;0,70)   | (0,10;0,11;0,13)   | (0,07;0,09;0,11)   | (0,10; 0,11; 0,12) | (0,14;0,15;0,17)   |
| Rackspace | (0,10;0,12;0,14)   | (0,40;0,50;0,60)   | (0,06; 0,08; 0,10) | (0,04; 0,05; 0,07) | (0,07; 0,08; 0,10) | (0,12;0,14;0,15)   |

Table 4.20 Positive distances of cloud computing technology service provider alternatives

|           | d1   | d2   | d3   | d4   | d5   | d6   | dtot |
|-----------|------|------|------|------|------|------|------|
| Azure     | 0,92 | 0,96 | 0,94 | 0,09 | 0,96 | 0,90 | 4,77 |
| AWS       | 0,82 | 0,91 | 0,90 | 0,89 | 0,85 | 0,85 | 5,22 |
| Rackspace | 0,88 | 0,93 | 0,94 | 0,92 | 0,86 | 0,86 | 5,40 |

Table 4.21 Negative distances of cloud computing technology service provider alternatives

| _         | d1   | d2   | d3   | d4   | d5   | d6   | dtot |
|-----------|------|------|------|------|------|------|------|
| Azure     | 0,08 | 0,04 | 0,06 | 0,09 | 0,04 | 0,10 | 0,41 |
| AWS       | 0,18 | 0,08 | 0,12 | 0,09 | 0,11 | 0,15 | 0,72 |
| Rackspace | 0,12 | 0,06 | 0,08 | 0,05 | 0,08 | 0,14 | 0,54 |

Table 4.22 Final performance indices of cloud computing technology service provider alternatives

# Final performance indices

| Performance Indices |      |
|---------------------|------|
| Azure               | 0,09 |
| AWS                 | 0,14 |
| Rackspace           | 0,10 |

Table 4.22 shows the final ranking and the most efficient cloud computing technology provider is AWS.

#### 5. CONCLUSION

Cloud computing is an important technology aiming to deliver a network of virtual services so that users can access them from anywhere in the world on subscription at competitive costs. The cloud service selection criteria are developed based on the literature review and a series of discussions with the case company's experts. The objective of this thesis was determining critical dimensions and critea in outsourcing of cloud service using integrated fuzzy DEMATEL, fuzzy ANP and fuzzy TOPSIS methods and applying this framework to an application study for deciding the most effective alternative.

Based on the assesements of the experts and our case study, the importance of the criteria for each dimension can be prioritized based on (D+R) values. In view of this, we evaluated the importance of dimensions/criteria using their (D+R) value that represents their importance. Thus, the priority rank is Vendor Related, Cloud Security, Cost and Functionality respectively. Obviously, Vendor Related and Cloud Security are the two most critical dimensions by numerical figures, while functionality is the least dimension to be taken into account. Considering both Vendor Related and Cloud Security is not helpful to effectively outsource a provider since these two dimensions are affected by the other dimensions. For functionality dimension; communication, deployment, availability, reliability and service stability are the most critical criteria. For healty and cost-effective processes of customers, cost dimension requires two critical criteria as support cost and flexibility must be first evaluated both by customers and providers.

The interdependencies between criteria obtained by fuzzy DEMATEL are then normalized and carried in the supermatrix of fuzzy ANP in order to evaluate and select the most suitable outsourcing alternative using fuzzy TOPSIS.

In light of the expert opinions and deep academics knowledge, priorities of our reviewed vendor related criteria were identified as vendor's reputation, community support, R&D capability, trustworthiness of the provider, documentation and experience in related products respectively. Eventually, relative weights for each cloud service outsourcing alternative are found out and the AWS is preferred as the most eligible

partner since it has the greatest relative weight. The rest of the alternatives are ranked as Rackspace, and the least preferred cloud computing technology service provider alternative is Azure to meet the needs of customer BlogTO.com. The proposed approach and applied case study illustrate how the model should be applied in real world decision processes. Other work such as Iosup et al. (2011), Cunha et al. (2011), Chang et al. (2012), Dasilva et al. (2013) have tried to compare the cloud service providers indicating the performance evaluation of clouds and their result also focuses AWS as chosen cloud computing service.

While we believe that the presented evaluation framework provides value, there are also further points that can be included. This study was based on consensus of opinions and future study can include consideration of different evaluations by the aid of group decision making. Future research could also include the application of the proposed approach to the different cloud service user companies.

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## **BIOGRAPHICAL SKETCH**

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