APPLICATION-BASED QOS EVALUATION OF HETEROGENEOUS NETWORKS

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ABSTRACT

Heterogeneous wireless networks expand the network capacity and coverage by leveraging the network architecture and resources in a dynamic fashion. However, the presence of different communication technologies makes the Quality of Service (QoS) evaluation, management, and monitoring of these networks very challenging. Each communication technology has its own characteristics while the applications that utilize them have their specific QoS requirements. Although, the communication technologies have different performance assessment parameters, the applications using these radio access networks have the same QoS requirements. As a result, it would be easier to evaluate the QoS of the access networks and the overall network configuration depending on the performance of applications running on them. Using such application-based QoS evaluation approach, the heterogeneous nature of the underlying networks and the diversity of their traffic can be adequately taken into account. In this paper, we propose an application-based QoS evaluation approach for heterogeneous networks. Through simulation studies, we show that this assessment approach facilitates better QoS management and monitoring of heterogeneous network configurations.

KEYWORDS

QoS; QoS metric; Dynamic weight; Unified QoS Metric; application weight; weight

1. INTRODUCTION

The advancement and proliferation of modern wireless and cellular technologies have changed the way people work and communicate. By 2018, the data traffic over mobile networks is expected to reach 15.9 exabytes per month, with 69 percent of that consisting of video. There will be over 10 billion mobile-connected devices by 2018, which will exceed the world’s expected population at that time [1]. To deal with this growing number of devices and the massive increases in traffic, the networks are moving towards an all-heterogeneous architecture. Any heterogeneous network constitutes of different communication technologies. These technologies have distinct bandwidths, coverage area, and operating frequencies. Their QoS characteristics, such as delay, throughput, and packet loss, as well as usage and implementation costs also differ from each other. As a result, the adaptation of heterogeneous network-based architecture for the provision of different applications especially multimedia applications faces significant
challenges. Among these challenges, QoS-related issues such as the effective QoS evaluation, management, and monitoring still top the list [2].

Managing QoS for video or voice applications over heterogeneous networks is a challenging task. A research from Nemertes shows that the companies invest a significant amount of their budget to manage VoIP applications over these network architectures. For small enterprises, the annual costs range from $25,000, and for global enterprises this cost is around $2 million [3]. Therefore, the enterprises need to dedicate a lot of their effort to ensure service quality at every level of the network. System downtime is another challenge for businesses, which could often happen due to poor network management and monitoring. According to Gartner research, the hourly cost of system downtime for large enterprises was $42,000, with a typical business on average, experiencing 87 hours of downtime per year [4]. As a result, the QoS of any service-based network should be monitored, managed, and evaluated on an ongoing basis.

In this paper, we introduce some unified metric measurement functions that can help with assessing the application-based performance of heterogeneous networks. By taking the relevant performance-related parameters into account, these functions quantify the underlying network and the application-related QoS with a numerical value. The proposed approach considers the effects of the QoS-related parameters, the available network-based applications, and the available Radio Access Networks (RANs) to characterize the network performance with a set of three integrated QoS metrics. The first metric denotes the performance of each possible application in the network. The second one is related to the performance of each of the radio access networks present in the network. The third one characterize the QoS level of the entire network configuration. The core of this method is considering the effects of different application and radio access networks on the QoS of heterogeneous networks.

The rest of the paper is organized as follows: Section 2 discusses the background and motivations of this work, Section 3 illustrates the concept of unified QoS metric. Section 4 presents the application weight calculations in detail. The impact and the significance of the applications for QoS analysis are then discussed in Section 5. The last section gives the conclusions and proposes the future works.

2. RELATED WORK AND MOTIVATIONS

QoS evaluation in heterogeneous networks has been an active area of research [5, 6]. Most of the existing research focuses on the partial QoS evaluation of a heterogeneous network by deriving the performance level of a single access network and a single application present within that environment. Also, different studies have come up with various performance metrics for QoS evaluation of these networks. The conventional methods do not consider the performance of all the applications running on a network. For example, if there are voice and video conferencing running over a UMTS network, these methods do not include the performance analysis of these applications to quantify the overall network QoS. Furthermore, there is no unified metric to quantify the QoS of a network, which considers the performance of all the access networks present in it. For example, in a heterogeneous environment, there are three access networks, such as UMTS, WiMAX, and LTE. At present, no unified metric can represent the performance of this network configuration using the QoS-related parameters of these access networks.
Multi-criteria decision-making (MCDM) or Multi-Attribute Decision Making (MADM) algorithms have been widely employed in the area of the heterogeneous networks from vertical handover perspectives [7, 8]. The most common criteria, which are considered during this ranking process, are service, network, and user related [9]. These can include received signal strength, type of the service, minimum bandwidth, delay, throughput, packet loss, bit error rate, cost, transmit power, traffic load, battery status of the mobile unit, and the user’s preferences. To facilitate the combining of these attributes into a single value, based on their relative importance, a weight is assigned to each attribute.

The weights for QoS-related parameters have both subjective and objective elements in it [10]. The network attributes, for example, the importance of received signal strength and bandwidth are objective in nature. Application related attributes such as delay, packet loss, and jitter show some objectivity. However, some studies have already revealed their potential subjective natures. For example, a study conducted in Tanzania shows that the users give moderate importance to end-to-end delay over packet loss [11]. The study by ETSI reveals that the users give strong importance to end-to-end delay over packet loss [12]. Therefore, the importance of application-related performance parameters can vary based on changing contexts, for example, between home and industrial environments or urban and rural areas. The significance of applications can vary depending on the context as well. For example, an application related to the education services can have higher importance compared to one that provides some entertainment services. Moreover, the absence or presence of an application will affect the weights of others in the network.

For weight assignment, the available literature on QoS evaluation in network selection has mostly used the Analytic Hierarchy Process (AHP) method, which is primarily developed by Saaty [7, 8, 13]. Some studies have also assigned fixed weights to these parameters based on their importance to service performance [14]. Both AHP and fixed weight methods are unable to handle the subjective and ambiguous factors related to weight determination such as context-based significance. In this study, Fuzzy Analytical Hierarchy Process (FAHP) with the extent analysis method is applied to bring the context-based information into the picture. This method is capable of handling ambiguity in any particular subject. It is also possible to assign the weights dynamically to the relevant parameters by using this method.

### 3. The Unified QoS Metric

The quality of service on any network or application is usually evaluated through a set of specific metrics. For example, to assess the performance of any voice application, the delay, jitter and packet loss are measured and compared with the acceptable values of these parameters. Similarly, the QoS of any network is evaluated through parameters such as delay, packet loss, throughput, and available bandwidth. The presence of different types of communication technologies and applications in a heterogeneous network makes its QoS assessment method a challenging task. To deal with such challenges, this paper introduces unified metric measurement functions.

The QoS evaluation approach proposed in this work considers any heterogeneous network as a set of three layers; these are the application layer, the radio access network layer and the network configuration layer. Each of these layers uses a function to quantify a unified QoS metric, which flows to the next layer and derive the combined metric of that layer. Figure 1 shows the flowchart of the proposed approach. In the application layer, a function is defined to derive the QoS of each
application through a unified metric. This function combines the values of several application-
related performance metrics. As such, the QoS of a network-based application is treated as a
function of QoS-related parameters. This can be expressed as:

\[ QoSAM_A = f(QP_1, QP_2, ..., QP_p) \]  

(1)

where \( A \) denotes a network-based application, and \( QP \) refers to the QoS-related parameters. Then
in the radio access network layer or RAN layer, the QoS of each access network, which are
present in the network, is evaluated. This evaluation is conducted based on the performances of
the active applications in those access networks. Hence, the QoS of an access network is viewed
as a function of the application QoS metrics. It can be expressed as:

\[ QoS_{R} = f(QoSAM_{A_{(1,2,..,n)}}) \]  

(2)

where \( R \) denotes any radio access network, and \( i \) refers to the number of active applications
present on a network. Finally, to evaluate the QoS of the overall network configuration another
function is defined, which uses the radio access network metrics as its input. This can be
expressed as:

\[ QoS_{CM} = f(QoS_{RM_{(1,2,..,n)}}) \]  

(3)

where \( j \) refers to the number of radio access networks present on a network.
4. THE APPLICATION WEIGHT CALCULATION

The weights of applications are considered during the QoS evaluation of radio access networks. The radio access network metric can be used to label a network as a particular service-oriented network such as education or health by integrating the application weights. For instance, if the QoS metric of a radio access network that is mainly used for health services, is always good, then that network can be taken as a suitable health service-oriented one for future use.

Table 1. Example of Application Weight Calculation

<table>
<thead>
<tr>
<th>Networks</th>
<th>Considered Parameters</th>
<th>Weights</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Application</td>
<td>Service</td>
</tr>
<tr>
<td>$N_1$</td>
<td>$A_1$</td>
<td>Education</td>
</tr>
<tr>
<td></td>
<td>$A_2$</td>
<td>Entertainment</td>
</tr>
<tr>
<td>$N_2$</td>
<td>$A_1$</td>
<td>Health</td>
</tr>
<tr>
<td></td>
<td>$A_2$</td>
<td>Education</td>
</tr>
</tbody>
</table>

The importance of the applications is subject to change depending on the requirements of particular networks. The service operators can update these criteria according to their particular circumstances. The criteria for this study have been formulated using the studies relevant to distance education-based service models [15]. For instance, in these service models, Videoconferencing (VC) bears more significance compared to voice-based applications. On the other hand, in a more general sense, VC may be less significant than voice-based applications as the latter is more easily amiable to the users. Therefore, the criteria to decide the applications weights in this regard can be the number of users using the application and the purpose and the context of that application usage.

Table 1 shows the example of two networks, $N_1$ and $N_2$, which have applications $A_1$ and $A_2$ with different number of users. The application weights are expressed as $w_{A_1}^{N_1}$, $w_{A_2}^{N_1}$, $w_{A_1}^{N_2}$, and $w_{A_2}^{N_2}$. In this paper, the weights of these applications are defined based on two criteria, the importance of the service, to which it belongs, and the number of users using that application. Other evaluation rules can be integrated based on individual needs. In the network $N_1$, it is considered that $w_{A_1}^{N_1} > w_{A_2}^{N_1}$. This is determined depending on the fact that in the network $N_1$, the application $A_1$ is used by more users than the application $A_2$ as the application $A_1$ is used for educational services, whereas, the application $A_2$ is used for entertainment services. Therefore, when the QoS metric in the network $N_1$ is calculated considering these application weights, the QoS metric value reflects the significance of the service the application provides. As a result, if the QoS value is good for the application $A_2$ and poor for the application $A_1$, the outcome of the QoS level of the
network will be poor. That is because, the majority of the users in that network experience poor performance for a valuable service. If, in any case, the entertainment service application has more users, the result will also be same as the education service is set to have higher significance than the entertainment service. These findings can change based on specific network requirements.

On the other hand, the Network $N_2$ supports both education and health services. As more users are using the health services compared to the education services, the application weight of $A_1$ is greater than $A_2$, i.e., $w_{A_1}^{N_2} > w_{A_2}^{N_2}$. If the QoS value of the network $N_2$ is good, then it can be categorized as a health service-oriented network. Therefore, the configurations of $N_2$ can be recommended for any network that aims to deploy network-based health services in the future. Service operators can input these criteria to change the weights dynamically for any network.

The weight calculation involves two steps. At first, the alternatives, criteria, and the fuzzy judgement matrix are defined. Then in the second step, the actual weight is calculated based on those measures. FAHP-based calculations include: establishing a set of alternatives $X = \{x_1, x_2, \ldots, x_m\}$, a set of goal or evaluation criteria $G = \{g_1, g_2, \ldots, g_n\}$, a fuzzy judgement matrix (FJM), with elements $\tilde{r}_{ij}$ that represents the relative importance of each pair of criteria $i$ and $j$, and a weighting vector $w = (w_1, w_2, \ldots, w_n)$. Both steps involve the concept of Triangular Fuzzy Number (TFN) and fuzzy addition and multiplication operations. To derive the FJM for the first step the importance scale presented in Table 2 is used. It shows the TFN $K_{t} = (l_t, u_t, m_t)$ where $t=1, 2, \ldots, 9$, and $l_t, u_t$ and $m_t$ are the lower, upper and the middle value of the fuzzy number $K_t$ respectively. Table 3 shows the pair-wise comparison matrix for VC, voice, and VS applications formed based on the cited studies. The importance scale of Table 1 is used for the comparisons. If one of the applications is absent from the network, these pair-wise comparison matrices are subject to change.

For the second step of FAHP, different methods are proposed. The most prominent one is Chang’s extent analysis method [16]. This method is chosen as it provides easy and flexible options for the weight calculation. The steps of the extent analysis method are as follows:

At first, the sums of the each row of the defined fuzzy comparison matrix are calculated. Then the normalization of the row sums is conducted using fuzzy multiplication to obtain fuzzy synthetic analysis. Therefore, in the fuzzy comparison matrix, the fuzzy synthetic analysis of criteria $G_i$ of alternative $X_m$ is calculated as:

$$D_{G_i}^{X_m} = \sum_{j=1}^{n} \tilde{r}_{ij} \otimes \left[ \sum_{i=1}^{n} \sum_{j=1}^{n} \tilde{r}_{ij} \right]^{-1}$$

$$= \left( \frac{\sum_{j=1}^{n} l_{ij} \sum_{j=1}^{n} m_{ij} \sum_{j=1}^{n} u_{ij}}{\sum_{i=1}^{n} \sum_{j=1}^{n} l_{ij} \sum_{i=1}^{n} \sum_{j=1}^{n} m_{ij} \sum_{i=1}^{n} \sum_{j=1}^{n} u_{ij}} \right)^{-1}$$

(4)

where $i, j = \{1, 2, 3, \ldots, n\}$ and $n$ is the number of criteria. In step 2, in order to rank the criteria against each alternative, the degree of possibility of two fuzzy numbers is applied. Therefore, $D_{G_2}^{X_1} (l_2, m_2, u_2) \geq D_{G_1}^{X_2} (l_1, m_1, u_1)$ is computed by the following equation:
Table 2. A FAHP-based Pair-wise Comparison Importance Scale

<table>
<thead>
<tr>
<th>Fuzzy Numbers</th>
<th>Definition</th>
<th>Triangular Fuzzy Number</th>
</tr>
</thead>
<tbody>
<tr>
<td>( k_1(l_1, m_1, u_1) )</td>
<td>Equal importance</td>
<td>((1,1,1))</td>
</tr>
<tr>
<td>( k_2(l_2, m_2, u_2) )</td>
<td>Intermediate values</td>
<td>((1/2,3/4,1))</td>
</tr>
<tr>
<td>( k_3(l_3, m_3, u_3) )</td>
<td>Moderate importance</td>
<td>((2/3,1,3/2))</td>
</tr>
<tr>
<td>( k_4(l_4, m_4, u_4) )</td>
<td>Intermediate values</td>
<td>((1,3/2,2))</td>
</tr>
<tr>
<td>( k_5(l_5, m_5, u_5) )</td>
<td>Strong importance</td>
<td>((3/2,2,5/2))</td>
</tr>
<tr>
<td>( k_6(l_6, m_6, u_6) )</td>
<td>Intermediate values</td>
<td>((2.5/2,3))</td>
</tr>
<tr>
<td>( k_7(l_7, m_7, u_7) )</td>
<td>Very strong importance</td>
<td>((5/2,3,7/2))</td>
</tr>
<tr>
<td>( k_8(l_8, m_8, u_8) )</td>
<td>Intermediate values</td>
<td>((3.7/2,4))</td>
</tr>
<tr>
<td>( k_9(l_9, m_9, u_9) )</td>
<td>Extreme importance</td>
<td>((7/2,4,9/2))</td>
</tr>
</tbody>
</table>

\[
V(D_{G_2}^{X_n} \geq D_{G_1}^{X_n}) = \sup \left[ \min \left( \mu_{D_{G_1}^{X_n}}(x), \mu_{D_{G_2}^{X_n}}(y) \right) \right] \tag{5}
\]

It can be also expressed as:

\[
V(D_{G_2}^{X_n} \geq D_{G_1}^{X_n}) = \text{hgt}\left(D_{G_2}^{X_n} \cap D_{G_1}^{X_n}\right) = \mu_{D_{G_2}^{X_n}}(d) = \begin{cases} 1 & \text{if } m_1 \geq m_2 \\ 0 & \text{if } l_1 \geq l_2 \\ \frac{l_2 - u_2}{(m_2 - u_2) - (m_1 - l_1)} & \text{otherwise} \end{cases} \tag{6}
\]

and

\[
V(D_{G_1}^{X_n} \geq D_{G_1}^{X_n}) = \text{hgt}\left(D_{G_1}^{X_n} \cap D_{G_2}^{X_n}\right) = \mu_{D_{G_1}^{X_n}}(d) = \begin{cases} 1 & \text{if } m_1 \geq m_2 \\ 0 & \text{if } l_2 \geq u_1 \\ \frac{l_2 - m_2}{(m_2 - m_1) - (m_2 - l_2)} & \text{otherwise} \end{cases} \tag{7}
\]

where \( d \) is the ordinate to validate if the highest intersection point \( D \) is between \( \mu_{D_{G_1}^{X_n}} \) and \( \mu_{D_{G_2}^{X_n}} \). Both the values of \( V(D_{G_2}^{X_n} \geq D_{G_1}^{X_n}) \) and \( V(D_{G_1}^{X_n} \geq D_{G_2}^{X_n}) \) are required to compare \( \mu_{D_{G_2}^{X_n}} \) and \( \mu_{D_{G_1}^{X_n}} \). For large numbers of criteria, the degree of possibility is applied as:

\[
V(D_{G_6}^{X_n} \geq D_{G_2}^{X_n}, D_{G_3}^{X_n}, \ldots, D_{G_9}^{X_n}) = V\left(\bigwedge_{i=2}^{9} (D_{G_i}^{X_n} \geq D_{G_2}^{X_n})\right) = \min_V \left( \mu_{D_{G_2}^{X_n}} \right) \tag{8}
\]
Table 3. Pair-wise Comparison Matrix for different Applications

<table>
<thead>
<tr>
<th>Applications</th>
<th>Criteria</th>
<th>VC</th>
<th>Voice</th>
<th>VS</th>
</tr>
</thead>
<tbody>
<tr>
<td>VC</td>
<td>Purpose of Usage</td>
<td>(1, 1, 1)</td>
<td>(3/2, 2, 5/2)</td>
<td>(1.09, 1.5, 2)</td>
</tr>
<tr>
<td></td>
<td>Number of Users</td>
<td>(1, 1, 1)</td>
<td>(2/3, 1, 3/2)</td>
<td>(1.3/2, 2)</td>
</tr>
<tr>
<td>Voice</td>
<td>Purpose of Usage</td>
<td>(2/5, 1/2, 2/3)</td>
<td>(0.54, 0.75, 1.09)</td>
<td>(2/3, 1, 3/2)</td>
</tr>
<tr>
<td></td>
<td>Number of Users</td>
<td>(2/3, 1, 3/2)</td>
<td>(1, 1, 1)</td>
<td>(5/2, 3, 7/2)</td>
</tr>
<tr>
<td>VS</td>
<td>Purpose of Usage</td>
<td>(2/3, 1, 3/2)</td>
<td>(0.59, 0.84, 1.25)</td>
<td>(0.48, 0.67, 0.95)</td>
</tr>
<tr>
<td></td>
<td>Number of Users</td>
<td>(1/2, 2/3, 1)</td>
<td>(2/7, 1/3, 2/5)</td>
<td>(1, 1, 1)</td>
</tr>
</tbody>
</table>

Assume that $d^i(C_{G_i}^{X_n}) = \min V \left\{ d_{G_i}^{X_n} \geq d_{G_i}^{X_n} \right\}$

In step 3, the weight vector $w$ for each alternative is calculated. This is obtained as:

$$w_i^T = \left( d^i(C_{G_1}^{X_n}), d^i(C_{G_2}^{X_n}), \ldots, d^i(C_{G_n}^{X_n}) \right)$$

In step 4, the normalized weight vector is calculated for each alternative as:

$$w_n = \left( d(C_{G_1}^{X_n}), d(C_{G_2}^{X_n}), \ldots, d(C_{G_n}^{X_n}) \right)^T$$

$$w_n = \left( \frac{d(C_{G_1}^{X_n}), d(C_{G_2}^{X_n}), \ldots, d(C_{G_n}^{X_n})}{\sum_{j=1}^{n} C_{G_i}^{X_n}, \sum_{j=1}^{n} C_{G_i}^{X_n}, \sum_{j=1}^{n} C_{G_i}^{X_n}} \right)$$

The weight vector of the considered applications is calculated as:

$$w_A(VC, Voice, VS) = (1.094, 0.56)$$

The normalization weight vector is as follows:

$$w_A = (w_{VC}, w_{Voice}, w_{VS}) = (0.4, 0.38, 0.224)$$

5. IMPACT OF APPLICATION IMPORTANCE

This section evaluates the impacts of dynamic application weights on the unified QoS metrics. The performance of a few network-based service models have been analyzed using the fixed
weight-based method in our previous work [17]. In this work, a detailed analysis is conducted to present the effects of dynamic weights on the performance of the same service models. The weights are calculated for each application according to the changing circumstances of the network. These weights are entered as inputs to derive the network QoS metric.

In the previous work, the voice application is set to have a higher importance than the VS application and the weights have been fixed as 0.6 and 0.4. In this work, those weights are set to change based on the pair-wise comparison matrices presented in Table 3. Figure 2 shows the QoS analysis of the scenario with twelve voice calls and one VS session on the network. The figure clearly indicates that when the voice and VS applications have equal importance, the access network has a good QoS level (e.g. 0.81). It shows an average QoS level (e.g. 0.62) for voice and a good QoS level (e.g. 1) for VS. When the importance level of voice application has been changed from having equal to extreme importance over VS application, the access network QoS comes down to an average value of 0.63. Although, the performance of the VS application is good, because of having a lower importance, it has less effect on the network QoS level. On the other hand, the voice application, being extremely important, has a greater impact on the network QoS level.

![Figure 2. The Effect of Application Importance on Network QoS](image)

Figure 3 shows a similar type of analysis with the altered importance of voice and VS applications. When the VS application has extreme importance, the network QoS improves due to the impact of application weights on the network performance.
Figure 3. The Effect of Application Importance on the Network Performance

Figure 4 illustrates the QoS in a voice-based network for different number of calls when the importance of the application changes. When the VC application has extreme and moderate importance over voice application respectively, the network shows a poor QoS level. The reason is that the VC application with ten and twenty voice calls on the network experience a poor quality. On the other hand, the network takes an average QoS level with ten and twenty voice calls when the voice application has moderate and extreme importance over VC application respectively.
6. CONCLUSIONS

In this paper, an application-based QoS analysis method has been proposed and evaluated. In assessing the overall QoS level of a heterogeneous network, the levels of importance of applications are included as weights. The key contributions of this work include the proposing of a methodical approach for calculating and applying these weights. Extensive simulation studies, utilizing these weights for QoS assessment of various heterogeneous configurations supporting a variety of applications, have also been carried out. These studies demonstrate how the inclusion of the application importance weights for QoS evaluations, can assist in a systemic choosing of a fitting network configuration. In our future works, we intend to include several other factors that can influence the QoS provisions of a heterogeneous network supporting real-time applications.

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