Experimental Evaluation of YouTube Performance on MPTCP-based LTE-WLAN Integration

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Abstract—Soaring demand for high-quality and data-intensive services such as video streaming pushing the limits of the cellular networks. In due time, the bandwidth requirement for these services will exceed the cellular network capacity. Now, it is vital to aggregate cellular (licensed) and WLAN (unlicensed) bands to keep pace with the increasing high bandwidth requirement. Multipath TCP (MPTCP) is a transport layer protocol which can be used to aggregate available bandwidths of multiple networks at a multi-homed User Equipment (UE). We evaluate the performance of LTE-WLAN Integration (LWI) using MPTCP in terms of Quality of Experience (QoE) of YouTube Ultra-High Definition (UHD) videos in a test-bed. As YouTube server does not support MPTCP, we use an architecture with MPTCP proxy which enables the use of MPTCP services to multi-homed UEs. To analyse the QoE, we have developed an application to search and play the YouTube videos. This application monitors the key performance metrics to evaluate QoE in terms of Mean Opinion Score (MOS). Our results show significant improvement in MOS values on individual network.

MPTCP is a promising transport-layer protocol that supports simultaneous use of multiple network interfaces at UE. MPTCP defines a set of extensions over the TCP, which allows the UEs to use multiple network interfaces for a single end-to-end connection by creating multiple TCP sub-flows at sender side and merging sub-flows at the receiver side to create a single TCP stream for upper layer protocol [4]. Each TCP sub-flow could take different paths in the network to reach destination. MPTCP is very helpful in mitigating network limitations, and it is also compatible with the TCP. MPTCP operates at the transport layer and aims to be transparent to both higher and lower layers. So MPTCP is used as the solution to integrate LTE and Wi-Fi in the mobile network. MPTCP can be used without any changes in the LTE architecture, and it can support both collocated and non-collocated network scenarios. Also, MPTCP does not require any special interface between eNB and UE to offload data over Wi-Fi. In MPTCP based LTE-Wi-Fi integration data split between Wi-Fi and LTE networks is taken care by MPTCP scheduler based on RTT values on individual network.

In this paper, we evaluate the performance of LWI using MPTCP in a test-bed using UHD video streaming from YouTube. To the best of our knowledge, this is the first-time MPTCP over LTE and WLAN network has been studied in a test-bed scenario. The main contributions of this paper are as given below:

- Evaluation of LWI using MPTCP proxy in a real test-bed using open source platform for LTE.
- Video QoE measurement for YouTube videos in a multi-homed UE using a new web application.
- Performance evaluation of LWI using MPTCP for UHD videos in term of video QoE compared to LTE or Wi-Fi used alone.

The remainder of the paper is organised as follows. Section II provides the related work. Section III describes the feasibility of LWI by deploying MPTCP proxy. We examine the MPTCP for YouTube video with a real-time test-bed in Section IV. Section V explains the application which we have developed to monitor the KPIs for YouTube and the approach to calculate MOS from the KPIs. Section VI evaluates the performance of LWI using MPTCP for YouTube in terms of QoE and we conclude the paper in Section VII with our finding. We use both Wi-Fi and WLAN interchangeably to...
II. RELATED WORK

Over the last five years, multiple research efforts have been carried out to enable MPTCP at the user end. Partov et. al. [5] explored MPTCP performance by a trace-driven approach using a python tool to send and receive packets through the LTE and WLAN interfaces simultaneously. Using this tool, they analysed different scheduling schemes for MPTCP.

Chen et. al [6] have studied the performance of MPTCP into the wild, using two different network scenarios with LTE+Wi-Fi and 3G+Wi-Fi. Their analysis shows that how MPTCP benefits the user for downloading the files of various sizes from an MPTCP enabled remote server. To analyse end-to-end MPTCP behaviour, they deployed MPTCP server in their campus premises and performed evaluation from the remote place. De Coninck et al. [7] and Viet-Hoang Tran et al. [8] have evaluated MPTCP using Android application and showed that how applications using both interfaces on smart-phone can split the data over LTE and Wi-Fi. As application content servers are not MPTCP enabled, they have deployed MPTCP enabled proxy over the cloud to provide MPTCP support to the application. However, due to the deployment of MPTCP proxy over the cloud, every user requests have to go through the cloud server, which introduces the unnecessary delay at the user end. Wu et. al. [9] have presented a Quality-Driven Multipath TCP (ADMIT) scheme that integrates the utility maximisation based Forward Error Correction (FEC) coding and rate allocation for streaming high-quality mobile video with MPTCP in Heterogeneous wireless networks.

Deng et. al. [10] have studied how network path quality affects the QoE of HTTP video streaming. They measured correlation between network QoS and application QoS. They also identified that the re-buffering frequency as a major factor for Mean Opinion Score (MOS) variance. Gmez et. al. [11] developed an Android application for YouTube QoE evaluation for wireless terminals that carries out measurements of objective QoS parameters, which are then mapped onto subjective QoE in terms of MOS using a utility function. Similar application ”YomoApp” have been developed by Wamser et. al. [12], which passively monitors key performance indicators (KPIs) of YouTube adaptive video streaming on a smartphone. They did not consider multi-homed mobile devices and performed the FLV parsing to find the KPIs. Mok et. al. [13] have characterised the correlation between the application and network QoS and performed subjective experiments to evaluate the relationship between application QoS and QoE. In their work, they concluded that the frequency of re-buffering is the main factor responsible for the variations in video QoE.

All of these studies did not analyse the effect of LWI on video QoE. Moreover, they have studied the performance of MPTCP by deploying it locally on MPTCP enabled server or by measurement in the environment where all the traffic is controlled. In contrast, we study the performance of LWI for UHD videos on YouTube, with real WLAN and LTE testbed, focused on QoE factors, that better represent the real time MPTCP experience for the end users.

III. LTE-WLAN INTEGRATION USING MPTCP

In LWA, LTE Evolved NodeB (eNB) can schedule packets/flows to be served on LTE and Wi-Fi. 3GPP defined two possible scenarios for LWA: non-collocated where WLAN Access Point (AP) and eNB connects through a standardised X_{u} interface and collocated in which Wi-Fi AP and LTE small cell are placed in the same box. This LWA requires changes in LTE architecture and UE and needs upgrading UEs and eNBs.

LWI can be achieved by using MPTCP at user and server equipment. Software changes are required at UE and content server to enable the end-to-end use of MPTCP. Some methods are available to allow the use of LWI without making changes on content servers as MPTCP is not deployed widely. So, if an UE has MPTCP enabled it can use LWI without any deployment dependency on end servers as shown in Fig. 1 below using MPTCP proxy.

![MPTCP proxy mechanism](image)

Network operators, who wish to enable the LWI on their network, can deploy this proxy mechanism. Such mechanism has been considered by some mobile network operators [14]. MPTCP proxy accepts the MPTCP connection from MPTCP enabled clients and maps the sub-flows of the MPTCP connection to different TCP flow towards the end server.

Service quality can be analysed with QoS based on some measurement parameters such as data rate, but it does not account quality perceived by the user i.e. QoE which represents user experience. The QoE has usually been evaluated through subjective tests carried out by the users to assess the degree of satisfaction using MOS indicator. This type of approach is of course quite expensive, as well as annoying to the user. In recent years, new methods have been used to estimate the QoE based on certain performance indicators called Key Performance Indicators (KPIs). These indicators can be measured by the UE and help in QoE measurement. In this work, we evaluate LWI with MPTCP using Ultra High Definition (UHD) videos from YouTube. To enable the use of LWI, we use an architecture with MPTCP proxy at the edge of the LTE network towards the Internet as shown in Fig. 2. To measure the KPIs for the video, we have developed an application that captures the KPIs for the YouTube videos, i.e., initial load time, buffer time, and buffer frequency and these KPIs are used to calculate MOS [13].

To analyse the MPTCP behaviour, trace files have been generated at the end device and used to find the data split between the available paths.
IV. TEST-BED SETUP

Fig. 2 illustrates the system architecture for LWI using an MPTCP proxy server. This architecture allows a user to use MPTCP service even though end server is not MPTCP enabled. If content servers is not MPTCP enabled proxy server converts MPTCP sub-flows to TCP flows otherwise it just forward the packets to the content server, allowing the user to use multiple network interface simultaneously to fetch the data from the server. Fig. 3 shows our test-bed setup used for experiments. For LTE network, we deployed OAI Software Alliance (OSA) test-bed which is developed by Eurecom [15]. OSA provides a standard-compliant implementation of a subset of Release 10 LTE for eNB, Mobility Management Entity (MME), Home Subscriber Server (HSS), Serving Gateway (SGW), and PDN Gateway (PGW) on standard Linux-based computing equipment (Intel x86 PC/ARM architectures). OAI LTE network has eNodeB (eNB) and Evolved Packet Core (EPC). In the test-bed, eNB, shown in Fig. 4, is deployed on a Linux machine with 3.4 GHz Intel Core i7 processor and 8GB DDR3 RAM, running 3.19 low latency Linux kernel. USRP B210 is used as LTE RF transmitter/receiver with 25 resource blocks, connected via USB 3.0 to an eNodeB system. MPTCP proxy is deployed on a machine with 2.4 GHz Intel Core i3 processor and 4GB DDR3 RAM, running 3.19 low latency Linux kernel. MPTCP Linux kernel with MPTCP version 0.9 and SQUID proxy version 3.1 [16]. We disable the caching SQUID proxy to avoid performance improvement due to cached data on the proxy server. MPTCP proxy works as a converter between MPTCP and TCP connections. UE creates the MPTCP sub-flows to connect with the proxy, and as the content server is not MPTCP enabled, MPTCP proxy creates separate TCP flow towards YouTube server for each sub-flow. We use a commercial Google Nexus 5 as LTE device running rooted Android 4.0 with MPTCP patch [17]. We use a programmable sim card with predefined network parameters (such as IMEI No., IMSI No., and MSISDN No.) to connect the Nexus 5 with the OAI testbed over LTE band 7. We use LTE band seven with 25 resource blocks as current version of OAI provide stable connection for these testbed settings. We use campus WLAN AP for Wi-Fi connectivity. Many users are attached to the AP and load varies with time as users join and leave the network. Several interfering WLAN networks are also operating. Wi-Fi download speed varies according to traffic load and some users connected to the network. To generate and analyse the packet trace, we used Wireshark on the end device which is a mobile workstation. This mobile workstation is connected to LTE network through USB Tethering with Nexus 5 and to WLAN through a Wi-Fi dongle. Traces generated during the experiment are used to find how data is split between LTE and Wi-Fi.

V. VIDEO QOE MEASUREMENT USING WEB APPLICATION

We have developed a hybrid application using IONIC framework to monitor the KPIs for YouTube videos to calculate the QoE in terms of MOS. The functionality of the application is made similar to YouTube using its data and player APIs. This application also collects the following KPIs to calculate the MOS of the video being played.

- Load/Initial Buffer Time \(T_{init}\): time taken by the YouTube player to buffer initial data before starting playback.
- Re-buffering Frequency \(f_{rebuf}\): frequency of rebuffering events during the playback.
- Mean re-buffering time \(T_{rebuf}\): average duration of a re-buffering event.

Each of these performance metrics \(T_{init}, f_{rebuf},\) and \(T_{rebuf}\) is divided into three levels (low, medium, and high) which are based on the \(25^{th}, 50^{th},\) and \(75^{th}\) percentiles of the actual metric [13]. The quantified performance metrics \(L_i, L_f,\) and \(L_{tr}\) take the numerical values 1, 2, and 3 to represent...
TABLE I
THREE VALUED LEVELS OF APPLICATION PERFORMANCE METRICS

<table>
<thead>
<tr>
<th>$T_{init}$</th>
<th>$L_{ti}$</th>
<th>$f_{rebuf}$</th>
<th>$L_{fr}$</th>
<th>$T_{rebuf}$</th>
<th>$L_{tr}$</th>
</tr>
</thead>
<tbody>
<tr>
<td>0 to 1 Sec</td>
<td>1</td>
<td>0 to 0.02</td>
<td>1</td>
<td>0 to 5 Sec</td>
<td>1</td>
</tr>
<tr>
<td>1 to 5 Sec</td>
<td>2</td>
<td>0.02 to 0.15</td>
<td>2</td>
<td>5 to 10 Sec</td>
<td>2</td>
</tr>
<tr>
<td>&gt;5 Sec</td>
<td>3</td>
<td>&gt;0.15</td>
<td>3</td>
<td>&gt;10 Sec</td>
<td>3</td>
</tr>
</tbody>
</table>

Fig. 3. OAI LTE test-bed setup showing LTE eNB connected with USRP B210 RF front, EPC, MPTCP proxy, and UE.

TABLE II
RTT (MS) BETWEEN UE TO MPTCP PROXY THROUGH LTE AND WI-FI NETWORKS AND MPTCP PROXY TO YOUTUBE SERVER

<table>
<thead>
<tr>
<th></th>
<th>Min</th>
<th>Avg</th>
<th>Max</th>
<th>Mdev</th>
</tr>
</thead>
<tbody>
<tr>
<td>LTE</td>
<td>12.052</td>
<td>17.51</td>
<td>26.19</td>
<td>3.87</td>
</tr>
<tr>
<td>Wi-Fi</td>
<td>2.67</td>
<td>11.686</td>
<td>30.562</td>
<td>6.893</td>
</tr>
<tr>
<td>MPTCP Proxy</td>
<td>24.613</td>
<td>24.751</td>
<td>24.945</td>
<td>0.129</td>
</tr>
</tbody>
</table>

VI. RESULTS AND ANALYSIS

Sub-flow RTT is imperative for LWI performance as MPTCP default scheduler “Lowest RTT” first sends data over sub-flow with lowest RTT until its congestion window is full, then it starts transmitting on the sub-flow with the next higher RTT. “Round Robin” another scheduler in MPTCP, send equal data over each sub-flow regardless of the properties of link used by sub-flow and “Redundant” scheduler yield data redundancy to achieve better success rate which may batter the performance of LWI as some of the data being sent over multiple channels will result as inefficient channel utilization. In our experiments, we use default “Lowest RTT” scheduler. As lowest RTT first scheduler depends on the RTT of the sub-flows so we measure the RTT of different paths to analyse the path priority of scheduler. Table II shows the RTT in low, medium, and high levels, respectively. The mapping from $T_{init}$, $f_{rebuf}$, and $T_{rebuf}$ to $L_{ti}$, $L_{fr}$, and $L_{tr}$ is done according to Table I [13]. The quantified performance metrics from Table I is used in [13] to obtain the MOS estimation from linear regression as given below.

$$MOS = 4.23 - 0.0672 \times L_{ti} - 0.742 \times L_{fr} - 0.106 \times L_{tr}$$ (1)

From the Eq. 1, it is clear that the maximum value of MOS can be 3.3148 for minimum value of $L_{ti}$, $L_{fr}$, and $L_{tr}$ from Table I. Re-buffering frequency metric ($L_{fr}$) has a high impact on QoE compared to initial buffering time ($L_{init}$) and re-buffering duration ($L_{tr}$). As YouTube server is not MPTCP enabled, we deployed MPTCP proxy and configured the UE to use this proxy server. To analyse the behaviour of MPTCP with YouTube, we generated network traces on the end device and analysed them to measure the packet split done by MPTCP.

Fig. 4. OAI eNB connected to USRP B210 board (RF Front) via USB 3.0 in OAI LTE test-bed setup.
millisecond (ms) from the UE to MPTCP proxy while using LTE and Wi-Fi.

Wi-Fi is used to establish primary sub-flow which carries the MP_CAPABLE and other control option of MPTCP to the server. It is evident from the data in the table II that Wi-Fi has lower RTT than LTE. Fig. 5 represents data split for different experiments between LTE and Wi-Fi networks for LWI. The plot shows that MPTCP sends more data over Wi-Fi network which is justified as Wi-Fi has lower RTT than LTE and also used as primary sub-flow. MPTCP path scheduler split the data based on the sub-flow RTT, so user or application cannot control the data split (for the current version of MPTCP) among the different paths in LWI using MPTCP, and it may also impact the LWI performance if sub-flow with lowest RTT is over a network with poor channel quality. For our video QoE experiments, we use “Samsung Galaxy S6 4K Ultra HD Video Sample” [18] which has a playtime of 66 seconds and download size of 131 MB for 4K (3840p x 2160p) and 50 MB for 2K (2560p x 1440p) resolutions. We calculate the MOS using Eq. 1 with quantized KIPs from Table I using the data collected from the experiments. Fig. 6 shows the MOS for 4K and 2K videos for LTE, Wi-Fi, and LWI. For 4K videos, LWI shows momentous improvement over single TCP connection using LTE and Wi-Fi. LWI has 34.4% better MOS value compared to LTE and 20.4% better than Wi-Fi for 4K videos. For 2K videos, network integration shows minimal improvement in MOS value over single TCP with LTE and Wi-Fi as the bit rate for YouTube 2K video for standard frame rate (30fps) is 8.4 Mbps which is nearly equal to the bandwidth available in both LTE and Wi-Fi networks. Over MPTCP, there is no variation on MOS as the available datarate is significantly increased by using LWI. Also, the data is split over LTE and Wi-Fi to reduce the data usage over LTE. The user need not worry about which network to use after seeing some degradation in the video playback.

Fig. 7 shows initial load time for 4K and 2K video in seconds using Wi-Fi, LTE, and LWI. Initial load time consists of connection setup time and time to buffer the required data before a player can start playing the video. In this phase,
As part of our future work, we plan to study how to control with LTE to ensure QoE improvement as the use of networks small capital expenditure. The operator should deploy Wi-Fi LWI without changing the LTE architecture can deploy it with to deploy, and any network operator who wishes to provide than LTE in our experiments. Evaluated architecture is easy to deploy, and any network operator who wishes to provide LWI without changing the LTE architecture can deploy it with small capital expenditure. The operator should deploy Wi-Fi with LTE to ensure QoE improvement as the use of networks with heterogeneous QoS may reduce the MPTCP performance. As part of our future work, we plan to study how to control

the packet split over LTE and Wi-Fi to offload more traffic over Wi-Fi without much degradation in video QoE.

<table>
<thead>
<tr>
<th></th>
<th>4K</th>
<th>2K</th>
</tr>
</thead>
<tbody>
<tr>
<td>Wi-Fi</td>
<td>5.52</td>
<td>4.55</td>
</tr>
<tr>
<td>LTE</td>
<td>5.89</td>
<td>2.86</td>
</tr>
<tr>
<td>LTE-WLAN</td>
<td>2.28</td>
<td>3.69</td>
</tr>
</tbody>
</table>

TABLE III
AVERAGE NUMBER OF REBUFFERINGS ($N_{rebuf}$) AND AVERAGE TIME TAKEN IN REBUFFERING ($T_{rebuf}$) FOR LTE, Wi-Fi, AND LTE-WLAN INTEGRATION FOR 4K AND 2K VIDEOS

VII. CONCLUSION AND FUTURE WORK
LWI is necessary to cater the high quality and data intensive services with acceptable user QoE. MPTCP can be used to facilitate the LWI. As MPTCP requires the modification of end server and user equipment to provide end-to-end MPTCP connection, MPTCP proxy can be employed in the operator’s network to enable MPTCP based LWI. We evaluated the performance of MPTCP based LWI architecture using a real-time LTE testbed and Wi-Fi for UHD videos. Results show that the MOS can be increased up to 34.4% compared to LTE and 20.4% as compared to Wi-Fi alone for 4K videos. The probability of the user seeing a video depends on the initial load time, and MPTCP can reduce initial load time by 17.39% by using MPTCP. Results show that more data is sent over Wi-Fi compared to LTE as WLAN has less RTT. By the use of LWI, initial load time is reduced by 35.0% compared to LTE and Wi-Fi respectively.

By the use of LWI, initial load time is reduced by 35.0% compared to LTE and Wi-Fi alone. The number of average buffering events and average buffer duration is reduced significantly.

REFERENCES

Fig. 8 shows time to buffer complete video with LTE, Wi-Fi and LWI. Here, MPTCP have a significant advantage over LTE and Wi-Fi network. This dominance feature of LTE-Wi-Fi integration for 4K videos does have a convincing impact on YouTube offline feature where the user gets YouTube video offline to watch later. Table III represents the data regarding the average number of buffering events and average buffer duration experienced by the user during playtime of the video. Results evidently show that LWI provides better performance than LTE and Wi-Fi alone. The number of average buffering events and average buffer duration is reduced significantly.