

# E-model Improvement for Speech Quality Evaluation Including Codecs Tandeming

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**Abstract:** - Speech quality evaluation is one of the fundamental aspects of telecommunications which has been frequently discussed since the inception of Internet telephony. Voice services providers should ensure adequate connection quality to end users. Using speech quality evaluation, they try to identify possible issues and to prevent service quality degradation as early as when the network is being designed. This article focuses on a non-intrusive method of speech quality evaluation in accordance with ITU-T recommendation G.107, known as the E-model. Real measurements that were carried out depending on codec tandeming in the communication system and causing the packet loss in IP telephony differed from results obtained using the PESQ method. This lead the authors to carry out an experiment in which the given scenario would be measured, its results assessed and a correction function that would fine-tune the E-model for tandeming was drafted.

**Key-Words:** - PESQ, E-model, MOS, Speech quality, codecs tandeming, IP telephony

## 1 Introduction

Methodologies to evaluate speech quality can be subdivided into two groups according to the approach applied, conversational and listening. Conversational tests are based on mutual interactive communication between two subjects through the whole transmission chain of the tested communication system. These tests provide the most realistic testing environment but are they are very time consuming. Listening tests do not provide such plausibility as conversation tests but are recommended more frequently [1]. According to methods of assessment, speech quality evaluation methodologies can be subdivided as subjective methods and objective methods. To evaluate speech quality, MOS (Mean Opinion Score) scale as defined by the ITU-T recommendation P.800 is applied [7].

### 1.1 MOS Scale

The basic scale as prescribed by the recommendation is depicted on Fig. 1. In order to avoid misunderstanding and incorrect interpretation of MOS values, ITU-T published ITU-T recommendation P.800.1 in 2003 [8].

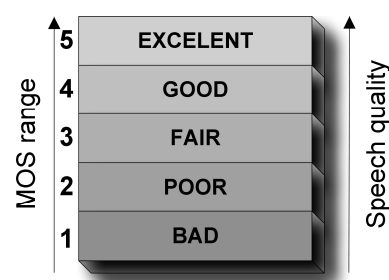


Fig. 1. MOS Scale.

This recommendation defines scales both for subjective and objective methods as well as for individual conversational and listening tests [7], [8].

## 1.2 Subjective Evaluation Methods

These methods are based on evaluation by human beings (listeners), i.e. subjects. During the testing, samples are played to a sufficient number of subjects, and their results are subsequently analysed statistically. Subjects can evaluate the speech quality on a five-degree scale in accordance with the MOS model as defined by ITU-T.

The best known representatives of these measurements include methods such as ACR (Absolute Category Rating) or DCR (Degradation Category Rating). Major disadvantages of these methods are high requirements on time, final evaluation being influenced by listener's subjective opinion and most of all impossibility to use them for testing in real time [7], [10].

## 1.3 Objective Evaluation Methods

The use of objective methods substitutes the necessity to involve humans in the testing by mathematical computational models or algorithms. Their output is again a MOS value or, depending on the algorithm applied, a different value which can be transferred to a MOS value using a suitable mapping function. The aim of objective methods is to estimate, as precisely as possible, the MOS value which would be obtained by a subjective evaluation involving sufficient number of evaluating subjects. Objective testing's exactness and efficiency is therefore a correlation of results from both subjective and objective measurements [1], [10]. Objective methods can be sub-divided into two groups, Intrusive and Non-intrusive.

### 1.3.1 Intrusive Approach

The core of intrusive (also referred to as input-to-output) measurements is the comparison of the original sample before releasing it into a transmission chain of a communication system with the output sample, transmitted through the system (degraded) [1], [10].

This type of testing includes, among other, the following methods: PSQM (Perceptual Speech Quality Measurement), PAMS (Perceptual Analysis Measurement System) developed by British Telecommunications and PESQ (Perceptual Evaluation of Speech Quality) [1], [10]. PESQ is the most common and most elaborate objective intrusive method. Computational technique applied by this method combines PAMS' robust temporal alignment techniques and the PSQM' exact sensual perception model. Its final version is contained in ITU-T recommendation P.862 [1], [9], [10].

### 1.3.2 Intrusive Approach

Contrary to intrusive methods which need both the output (degraded) sample and the original sample, non-intrusive methods do not require the original sample. This is why they are more suitable to be applied in real time. Yet, since the original sample is not included, these methods frequently contain far more complex computation models. Examples of these types of measurements frequently use INMD (in-service nonintrusive measurement device) that has access to transmission channels and can collate objective information about calls in progress without disrupting them. These data are further processed using a particular method, with a MOS value as the output [1], [10]. The method defined by ITU-T recommendation P.563 or a more recent computation method E-model defined by ITU-T recommendation G.107 are examples of such measurements [3].

## 2 E-model

Complexity of modern networks requires that individual parameters of the transmission path are not assessed separately but rather that all their possible combinations and their interaction are considered. This can partially be achieved by an expert estimate based on the parameters of the transmission path, yet using a computation model is a more systematic approach. The E-model is a computation model which takes into account all the links between transmission parameters. Its output is a scalar labelled R which is a function of total expected call quality. The E-model is based on the "equipment impairment factor" method. The original structure of this model was developed by Swedish expert Nils-Olof Johansson, member of the Voice Transmission Quality from Mouth to Ear group under ETSI. This model was further developed by the SG12 group under ITU-T and it was published in ITU-T recommendation G.107 as the E-model [1], [3], [13]. The structure of the connection reference model is depicted on Fig. 2.

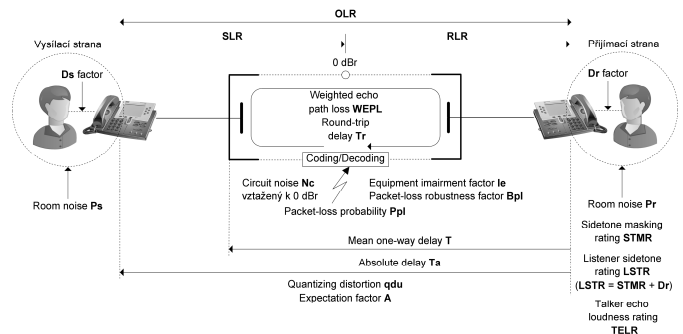


Fig. 2. Reference model for E-model computation.

The computational model consists of various mathematical operations over all parameters of the transmission system. The computation itself can be split

into several elements and can be expressed by the following equation (1).

$$R = Ro - Is - Id - Ie - eff + A \quad (1)$$

$Ro$  represents the basic delay of the signal from the noise which includes all types of noise, such as noises caused by the device's electrical circuit and noises arisen on the wiring.  $Is$  comprises all possible impairments combinations that appear more or less simultaneously with a useful voice signal. Factor  $Id$  represents all impairments which are caused by different combinations of delays.  $Ie - eff$  comprises impairments caused by using a particular voice codec, occurrence of packet loss and its resistance against losses. Last, parameter  $A$  slightly adjusts the final quality depending on user's concentration [4], [5].

### 3 Experiment with Codecs tandeming

Two kinds of experimental measurements were carried out – simulation using the E-model and, to enable comparison, measurement using the objective intrusive method PESQ. Measurements reflected the impact of codec tandeming, i.e. use of several voice codecs consecutively along the transmission path. In addition, the impact of IP telephony packet losses in one of the segments on the transmission path on the overall call quality was also taken into account. Fig. 3 shows the structure of the measuring testbed in which measurements using the PESQ method were carried out.

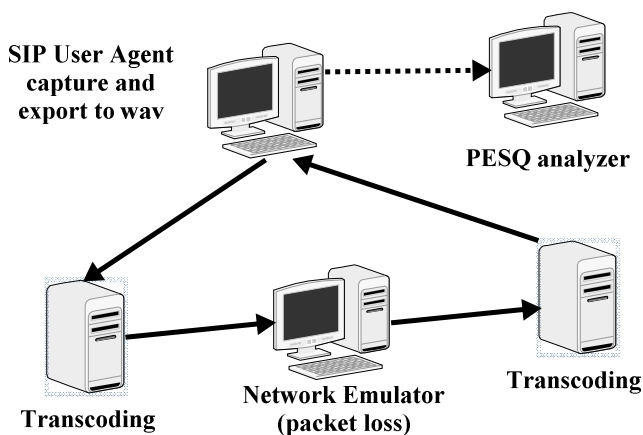


Fig. 3. Measuring testbed.

Voice codec G.711 A-law was applied between the SIP User Agent's and transcoding gateway. Between the two transcoding gateways, codecs G.711  $\mu$ -law, G.729, G.726 and G.723.1 (ACELP) were applied in sequence. In addition, packet loss ranging from 0 – 10% with a 0.5 % step was simulated at Network emulator.

### 3.1 Simulation in E-model

In order to simulate quality using the E-model, the authors of the article developed an application in Java in accordance with ITU-T recommendation G.107 (04/2009) [3]. In addition to parameters defined by the recommendation, the application can also determine the final quality depending on codec tandeming. The chapter dealing with the E-model indicates that the impact of codecs is covered by parameter  $Ie - eff$ . In the E-model, the overall impact of codecs in cascade is therefore defined as a sum of partial impacts  $Ie - eff$  for individual parts of the transmission path. This can be expressed by equation (2). By applying the prior equation, we can determine the impact for each part of the transmission path separately in equation (3).

$$Ie - eff = Ie - eff_1 + Ie - eff_2 + \dots + Ie - eff_n \quad (2)$$

$$Ie - eff_n = Ie_n + (95 - Ie_n) \cdot \frac{Ppl_n}{\frac{Ppl_n}{BurstR} + Bpl_n} \quad (3)$$

The computation application using the E-model is currently in version 1.3. It also contains a function visualising the relations between  $R$  and MOS value and various parameters in a chart. The chart can be further amended as required. Fig. 4 is an example of this application's main window.

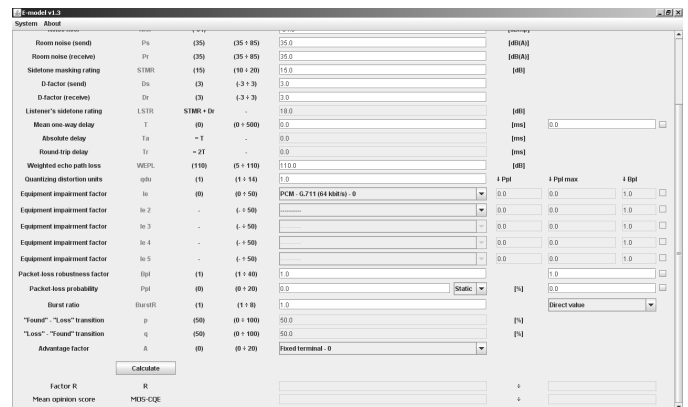


Fig. 4. E-model v1.3 application's main window.

### 3.2 Evaluation using PESQ

The experimental testbed for evaluation using PESQ method was established in the IP telephony laboratory in Ostrava and was set up as shown on Fig. 3. The SIP User Agent comprised both transmitting and receiving section. The User Agent consisted of SPITFILE software system, SPITFILE was developed at our department [11], [12]. This application ran under Linux (Ubuntu 9.10) on a virtual machine created by VMware. Transcoding Gateways were Cisco Systems routers

equipped with Voice IOS in which transcoding was carried out. The Network was simulated by the NE1000 component from US company Simena which enables to emulate different network parameters. In our case, it emulated loss of transmitted packets.

### 3.3 E-model's Approach to Codecs Tandeming

Having studied ITU-T resources, we established that the SG12 working group which developed the E-model, did not concern itself with codec tandeming. This was the impetus to carry out this experiment. To establish to what extent the E-model in this particular case converges to reality, it was necessary to adopt a suitable method for comparison. The standard objective method is the evaluation according to PESQ defined by ITU-T recommendation P.862 [9].

## 4 Results and Correction Function Draft

The measurements were carried out for about one month in the IP telephony laboratory at the Department of Telecommunications in Ostrava. Measurements were carried out six times for each codec and each loss value in order to eliminate possible statistical variances and errors. Thus, we obtained more than 1 200 values. Tables below (1–5) provide an overview of results obtained using the E-model and PESQ for individual codecs in individual loss ranges.

TABLE I. RESULTS FOR CODEC G.711 A-LAW

Packet loss [%]	G.711 A-law		
	E-model [MOS]	PESQ [MOS]	Difference [MOS]
0	4.41	4.10	0.31
0.5	4.14	3.95	0.19
1	3.83	3.82	0.01
1.5	3.53	3.69	0.16
2	3.26	3.57	0.31
2.5	3.01	3.46	0.45
3	2.79	3.35	0.56
3.5	2.61	3.24	0.63
4	2.44	3.15	0.71
4.5	2.30	3.06	0.76
5	2.17	2.98	0.81
5.5	2.06	2.90	0.84
6	1.96	2.83	0.87
6.5	1.87	2.76	0.89
7	1.80	2.71	0.91
7.5	1.73	2.66	0.93
8	1.67	2.61	0.94
8.5	1.61	2.57	0.96
9	1.56	2.54	0.98
9.5	1.52	2.52	1.00
10	1.48	2.50	1.02

TABLE II. RESULTS FOR CODEC G.711  $\mu$ -LAW

Packet loss [%]	G.711 $\mu$ -law		
	E-model [MOS]	PESQ [MOS]	Difference [MOS]
0	4.41	4.10	0.31
0.5	4.14	3.98	0.16
1	3.83	3.85	0.02
1.5	3.53	3.73	0.20

2	3.26	3.61	0.35
2.5	3.01	3.48	0.47
3	2.79	3.36	0.57
3.5	2.61	3.23	0.62
4	2.44	3.10	0.66
4.5	2.30	2.97	0.67
5	2.17	2.84	0.67
5.5	2.06	2.71	0.65
6	1.96	2.58	0.62
6.5	1.87	2.45	0.58
7	1.80	2.31	0.51
7.5	1.73	2.17	0.44
8	1.67	2.04	0.37
8.5	1.61	1.90	0.29
9	1.56	1.76	0.20
9.5	1.52	1.62	0.10
10	1.48	1.48	0.00

TABLE III. RESULTS FOR CODEC G.729

Packet loss [%]	G.729		
	E-model [MOS]	PESQ [MOS]	Difference [MOS]
0	4.14	4.07	0.07
0.5	4.06	3.99	0.07
1	3.98	3.90	0.08
1.5	3.89	3.82	0.07
2	3.81	3.74	0.07
2.5	3.73	3.66	0.07
3	3.65	3.58	0.07
3.5	3.57	3.50	0.07
4	3.49	3.43	0.06
4.5	3.41	3.36	0.05
5	3.34	3.29	0.05
5.5	3.27	3.22	0.05
6	3.20	3.15	0.05
6.5	3.13	3.09	0.04
7	3.07	3.03	0.04
7.5	3.01	2.96	0.05
8	2.95	2.91	0.04
8.5	2.89	2.85	0.04
9	2.83	2.79	0.04
9.5	2.78	2.74	0.04
10	2.72	2.69	0.03

TABLE IV. RESULTS FOR CODEC G.726

Packet loss [%]	G.726		
	E-model [MOS]	PESQ [MOS]	Difference [MOS]
0	4.24	4.27	0.03
0.5	4.16	4.20	0.04
1	4.09	4.14	0.05
1.5	4.02	4.07	0.05
2	3.94	4.01	0.07
2.5	3.86	3.94	0.08
3	3.79	3.87	0.08
3.5	3.71	3.80	0.09
4	3.64	3.73	0.09
4.5	3.57	3.66	0.09
5	3.50	3.59	0.09
5.5	3.43	3.52	0.09
6	3.36	3.44	0.08
6.5	3.29	3.37	0.08
7	3.23	3.29	0.06
7.5	3.17	3.22	0.05
8	3.11	3.14	0.03
8.5	3.05	3.06	0.01
9	2.99	2.98	0.01
9.5	2.94	2.90	0.04
10	2.88	2.82	0.06

TABLE V. RESULTS FOR CODEC G.723.1

Packet loss [%]	G.723.1		
	E-model [MOS]	PESQ [MOS]	Difference [MOS]
0	3.79	3.78	0.01
0.5	3.72	3.77	0.05
1	3.65	3.75	0.10
1.5	3.58	3.72	0.14
2	3.52	3.69	0.17
2.5	3.46	3.66	0.20
3	3.39	3.62	0.23
3.5	3.33	3.58	0.25
4	3.27	3.53	0.26
4.5	3.21	3.48	0.27
5	3.16	3.42	0.26
5.5	3.10	3.36	0.26
6	3.05	3.29	0.24
6.5	3.00	3.22	0.22
7	2.95	3.14	0.19
7.5	2.90	3.06	0.16
8	2.85	2.98	0.13
8.5	2.80	2.89	0.09
9	2.76	2.79	0.03
9.5	2.71	2.69	0.02
10	2.67	2.58	0.09

Results as shown in tables 1–5 clearly indicate significant heterogeneity between data obtained by means of the E-model and by means of PESQ. If we take MOS values obtained by means of PESQ as correct, MOS values simulated by the E-model need to be adjusted using a correction function. Let  $MOS(Ppl)'$  stand for values after correction and  $MOS(Ppl)$  stand for original values. Values depend on the current  $Ppl$  size, i.e. on loss rate of packets transmitted. The resulting function is described by equation (4).

$$MOS(Ppl)' = MOS(Ppl) - \left\{ \begin{array}{l} \underbrace{a + \frac{A}{B}}_{\text{A}} + \underbrace{b \cdot (Ppl - c)^2 - d}_{\text{B}} + \underbrace{(Ppl \cdot e)}_{\text{C}} \end{array} \right\} \quad (4)$$

Fig. 5 explains individual correction function's elements. Parameter A in equation (4) determines the shift in all values irrespective on loss rate  $Ppl$  by  $a$  up or down, provided the difference between the original and estimated MOS values is constant. Parameter B adjusts the original values where they differ from the referential ones hyperbolically, i.e. the loss rate  $Ppl$  is such that the difference between original MOS values is the highest. Coefficient  $c$  stands for the top of the hyperbola where the difference is the biggest; coefficient  $d$  stands for its size and coefficient  $b$  determines the twist of the hyperbola depending on the sign and its overall "average". Lastly, parameter C adjusts the output data where the difference between the original and estimated MOS values grows linearly with the increasing loss rate.

Table 6 provides an overview of the proposed values of correction function's coefficients for individual codecs.

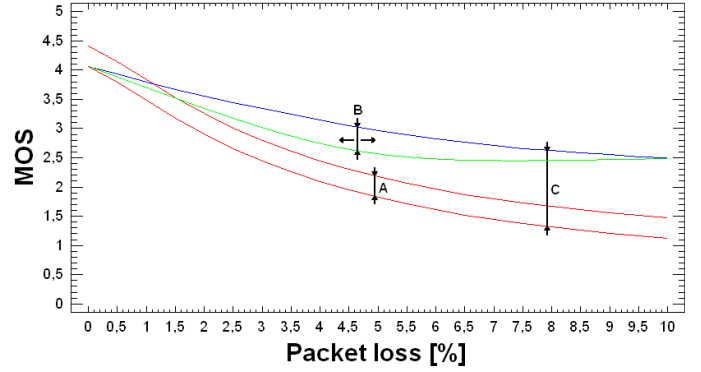


Fig. 5. Correction function parametres explanation.

TABLE VI. COEFFICIENTS OF CORRECTION FUNCTION

Codec	Coefficient				
	$a$	$b$	$c$	$d$	$e$
G.711 A-law	0.34	0.019	5	0.5	-0.14
G.711 $\mu$ -law	0.31	0.038	5	0.98	0
G.729	0.07	0	0	0	-0.0035
G.726	-0.06	0.0033	6	0.09	0.015
G.723.1	0.01	0.0115	5	0.315	0.009

Values obtained by means of the E-model, which were adjusted using the correction function with coefficients as defined in Table 6, confirmed improvements against original values (Tables 1–5). Initially, the differences reached up to one MOS grade, and were reduced to hundredth of a MOS grade after the correction, an example is depicted on Fig. 6.

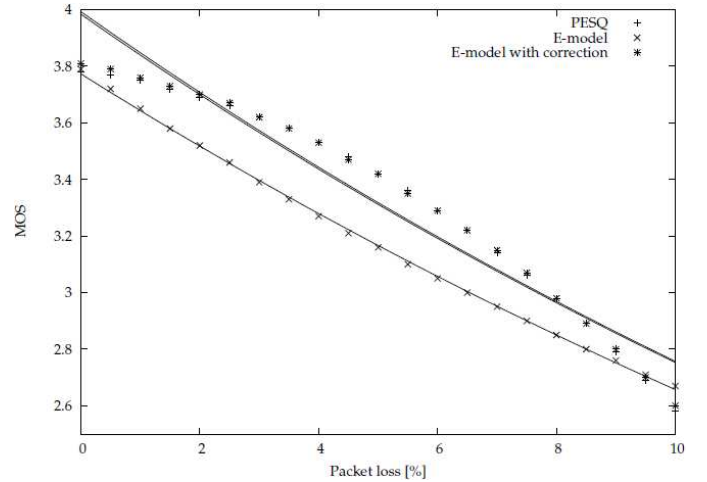


Fig. 6. Graphical results for codec G.723.1 (ACELP).

## 5 Conclusion

The E-model brings a modern approach to the computation of estimated quality, allowing for easy implementation. One of its advantages is that it can be applied in real time. The method is based on a mathematical computation model and can be applied as early as the planning stage a new communication

system. The E-model is classified as objective non-intrusive methods and is applied primarily in the Voice over IP technology. The latest version of ITU-T recommendation G.107 was drafted in 2009, but the development of the E-model is by no means finished [3]. The second part of the paper aimed at showing and proving in practice that the E-model in its current version does not reflect the reality and that the SG12 group failed to address certain significant influences (such as codec tandeming). To enable results comparison, PESQ was applied in accordance with ITU recommendation P.862 which these days is considered de-facto as a standard for determining MOS [9]. The authors would like to stress two significant benefits of their paper. The first being a statement, confirmed by the experiment, that the E-model in tandeming structure does not correspond with results obtained through measurements. The second being the design of a correction function and the way to enhance the E-model. Results depend strongly on choosing suitable coefficients. This is why it is necessary to study the issue further and more deeply and to design its adjustments for other codec structures. Another output of the work is an application in JAVA which enables computations using the E-model for end users.

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