

**Quality &  
Usability  
Lab**



# Updates on Standardization Activities with Respect to Gaming Quality of Experience

Steven Schmidt

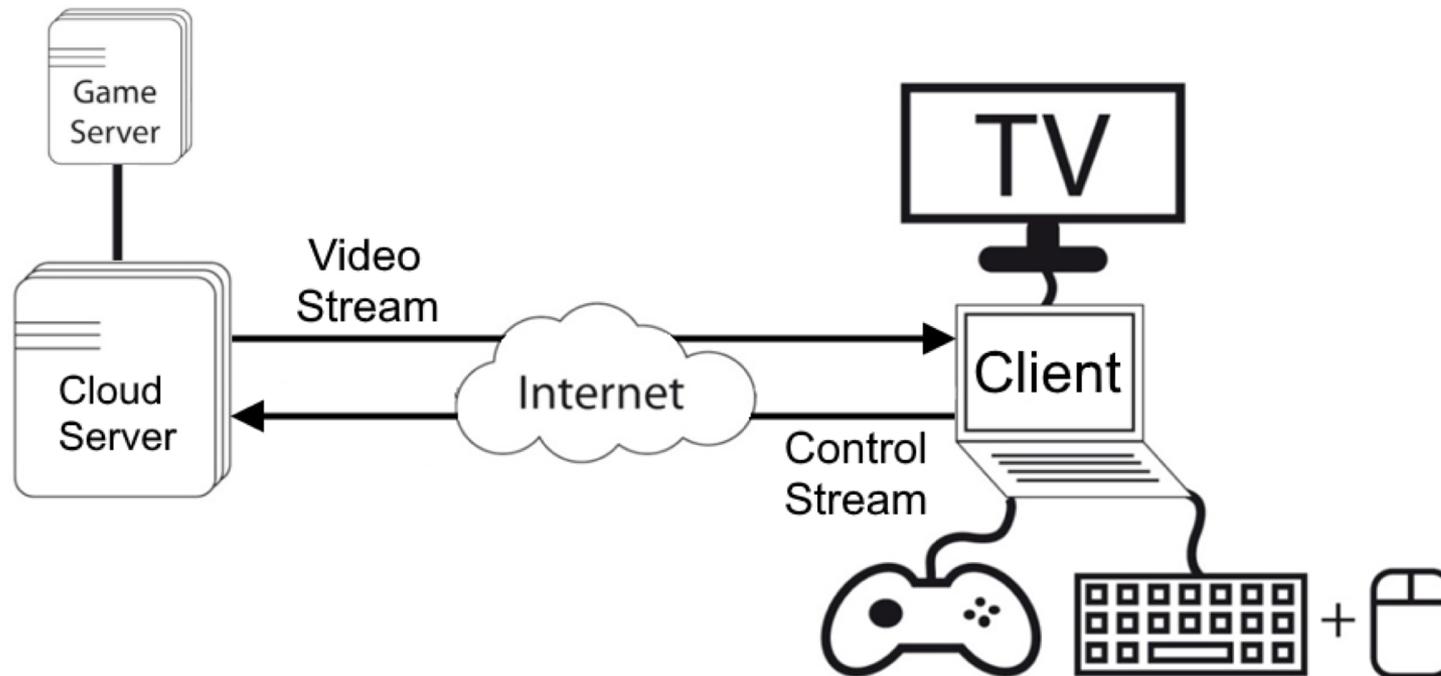
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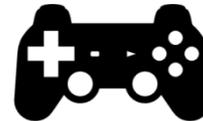
# What is Cloud Gaming?





# Quality of Experience

## Cloud Gaming

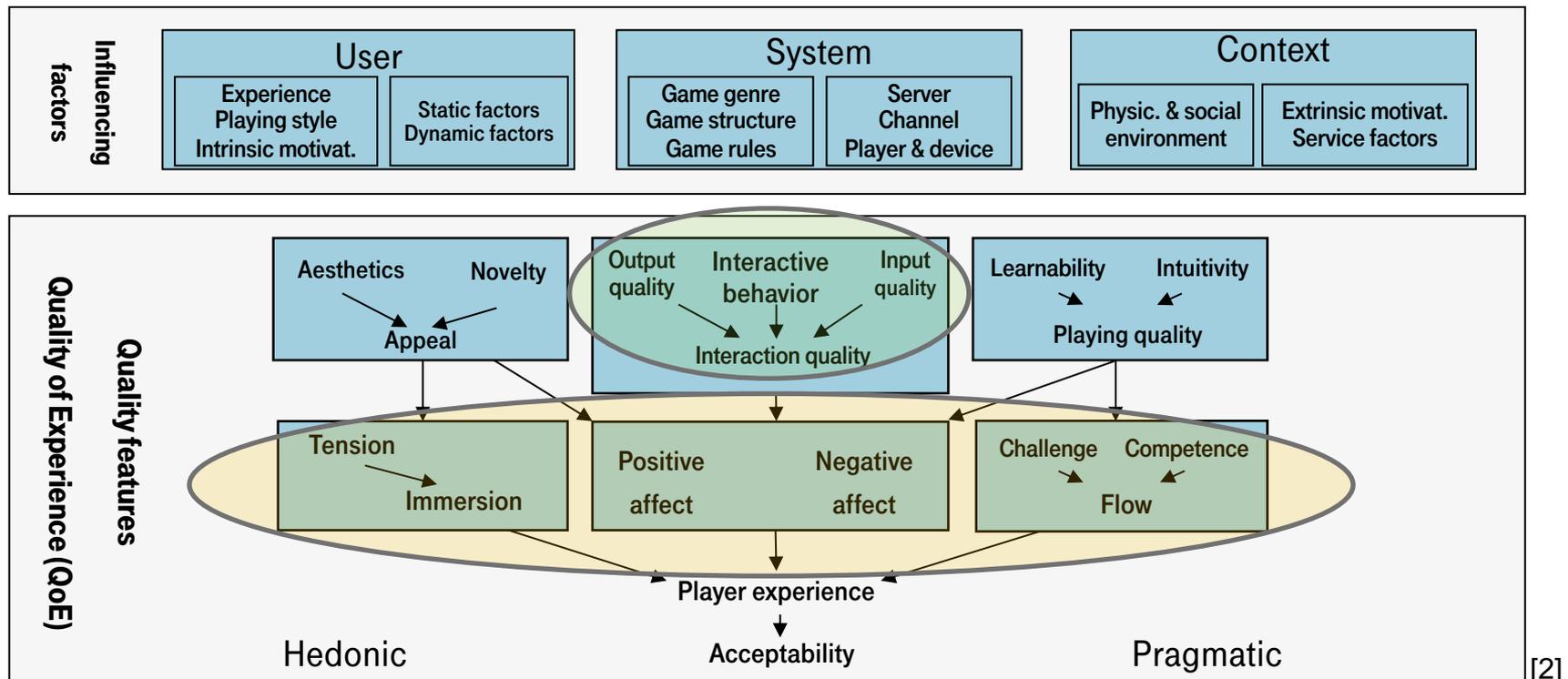


- 2.3 billion gamers will spend \$137.9 billion on video games in 2018<sup>[1]</sup>
- Companies in the past could not provide acceptable QoE
- Creation of **3 work items** in ITU-T SG-12
- ITU-T Rec. G.1032 (10/2017) – G.QoE-gaming:
  - **Influence factors** on gaming quality of experience
- ITU-T Rec. P.809 (05/2018) – P.GAME:
  - **Subjective evaluation** methods for gaming quality
- Future ITU-T Rec. G.OMG (studied in Q.13/12):
  - **Opinion model** for gaming applications





# What is Gaming Quality of Experience?



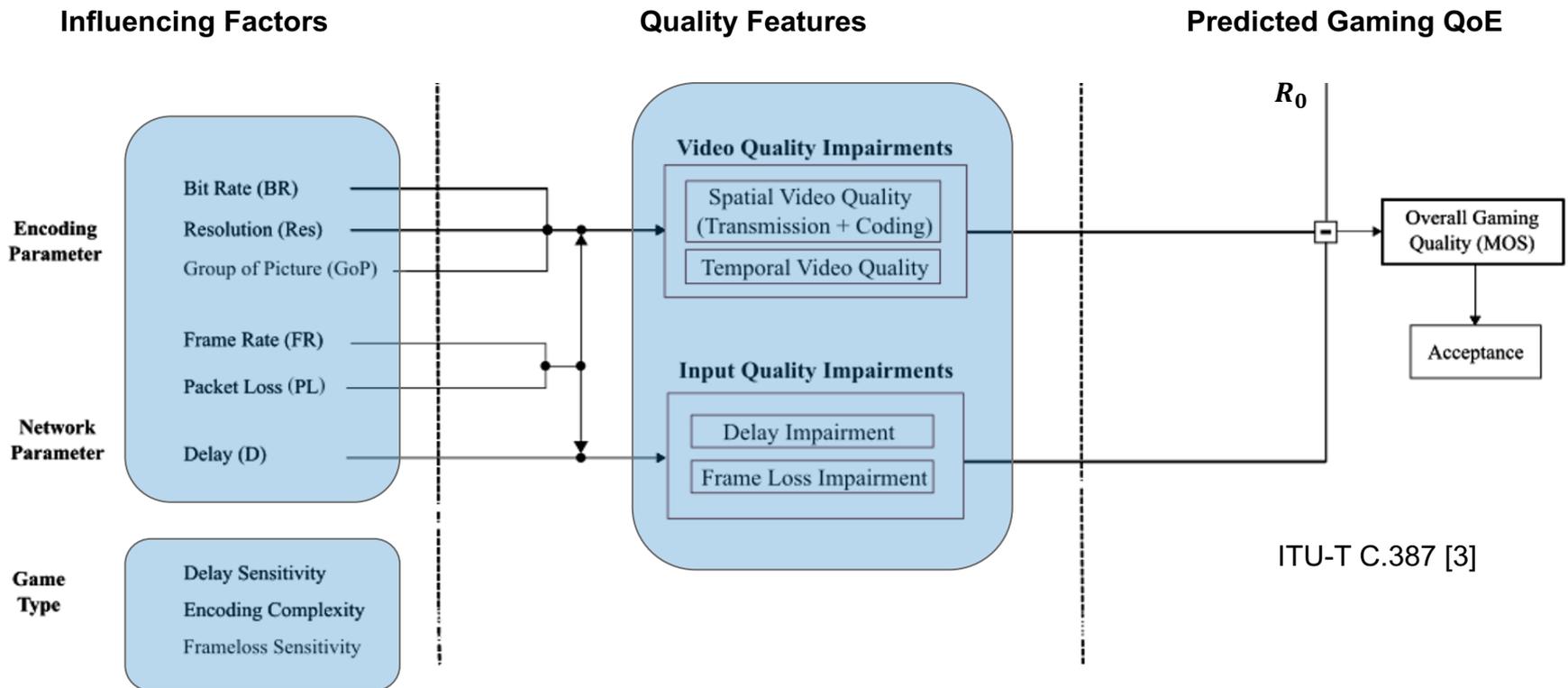


## Future ITU-T Rec. G.OMG [8]

- **Predict** overall gaming **QoE based on impairment factors** using encoding and network parameters
- Two modes depending on available information about game content
- **Scope:**
  - Considering relevant factors identified in ITU-T Rec. G.1032
  - Network planning tool (infrastructure and resource allocation)
  - Target services: cloud gaming
  - Target group: non-professional gamer
  - Not: VR gaming, mobile devices, social aspects (but might be applicable)
  - Not: influence of the design of games or the motivation of users to play



# Future ITU-T Rec. G.OMG

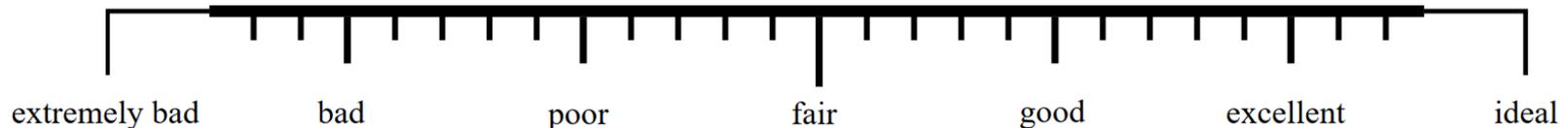




## Assessment of Quality Features

- Guidelines for assessment are given in ITU-T Rec. P.809
- Agreed to use 7-point continuous rating scales [ITU-T Rec. P.851]
- Adaptation of Game Experience Questionnaire [4]
- Video Quality dimensions by Schiffner [5]
- Overall Gaming QoE

How do you rate the overall quality of your gaming experience?

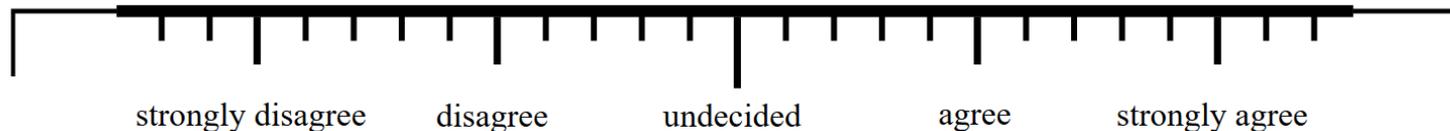




## Assessment of Quality Features

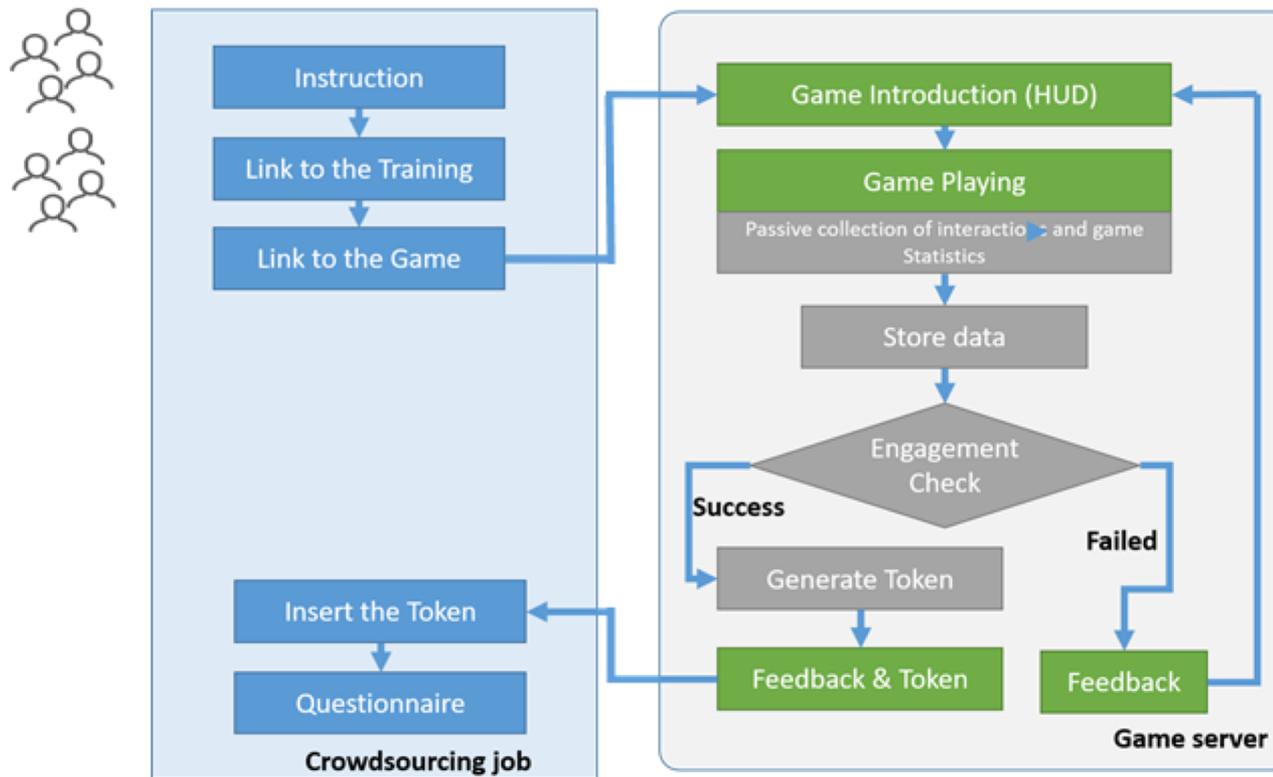
- Development of new questionnaire assessing Input Quality (Playability)
  - Pool of items created based on literature and expert interviews
  - Development of web-based games (JS) including typical degradations
  - Crowdsourcing approach used to gather ratings from many diverse users
  - 2-level factor analysis (EFA+CFA)
  - 3 sub-dimension: controllability, immediate feedback, responsiveness

I received immediate feedback on my actions.





# Assessing gaming QoE using Crowdsourcing



ITU-T C.376 [6]



## Related documents and dataset for G.OMG

- **Requirement specification** submitted in May 2018 [ITU-T C.200]
- **Data assessment** process will be discussed in Dec 2018 [ITU-T C.293]
- First Draft for an **Opinion Model Predicting Gaming QoE** in May 2019 [ITU-T C.387]
  
- **Interactive dataset:**
  - 9 different games
  - 1080p: 2, 4, 6, 50 mbps
  - Frame Rate: 60, 30, 20, 10 fps
  - Frame Loss Rate: 0, 10, 15, 25, 30 %
  - Delay: 0, 25, 50, 100, 200, 400 ms
  
- **Passive dataset:**
  - 9 (now 18) different games
  - 480p: 0.3, 1, 2, 4 mbps
  - 720p: 1, 2, 4, 50 mbps
  - 1080p: 2, 4, 6, 50 mbps
  - 20, 30, 60 fps
  - (UDP packet loss + GoP)

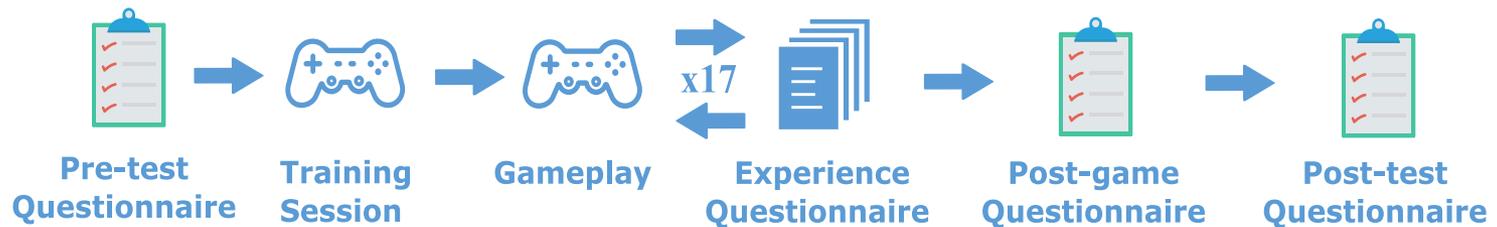
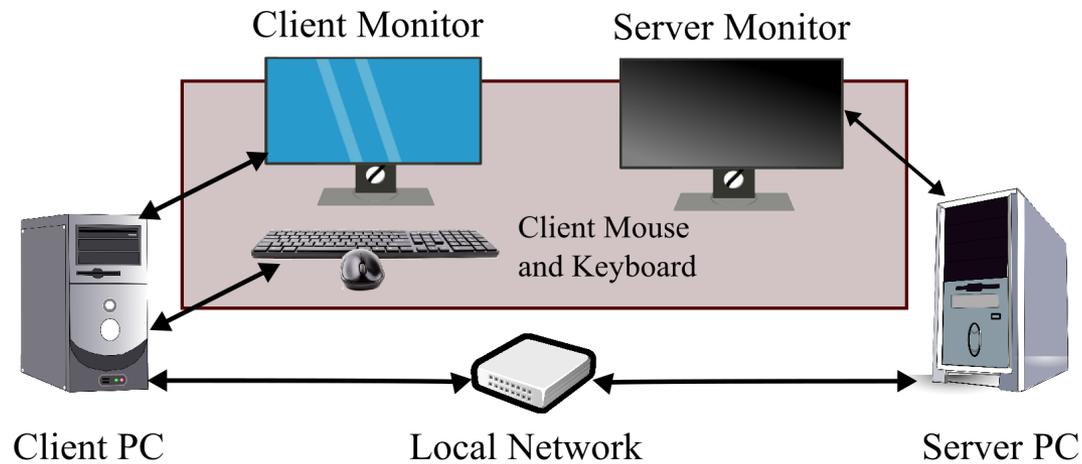


## Factors and application ranges

| Application information    | Value range, unit                |
|----------------------------|----------------------------------|
| Sequence duration (secs)   | 30 (passive), 90 (interactive)   |
| Screen size                | 24"                              |
| Input devices              | Mouse and keyboard               |
| Packetization              | RTSP (over RTP/UDP/IP)           |
| Video codec                | NVENC                            |
| Resolution                 | 480p, 720p, 1080p                |
| Coded video bitrate (kbps) | 300-50000                        |
| Frame rate (fps)           | 10, 20, 30, 60                   |
| Pre-set                    | llhq (low latency, high quality) |
| Encoding Mode              | CBR                              |
| Video Compression          | Standard H.264, Main 4.0         |
| Audio codec                | AC3                              |
| Coded audio bitrate (kbps) | 192 (stereo)                     |
| Audio sample rate (Hz)     | 48,000                           |
| Packet loss degradation    | uniform loss (0-1 %)             |



# Setup and Test Structure





# Data Transformation

Continuous 7-points ratings has to been transformed to the R-scale

1. Transformation of extended continuous 7-point ratings (EC) to 5-point ACR ratings using the transformation presented in [7]:

$$\widehat{MOS}_{ACR} = f(\widehat{MOS}_{EC}) = -0.0262 \cdot \widehat{MOS}_{EC}^3 + 0.2368 \cdot \widehat{MOS}_{EC}^2 + 0.1907 \cdot \widehat{MOS}_{EC} + 1$$

2. Normalize MOS values as follows, as some condition means were larger than 4.5:

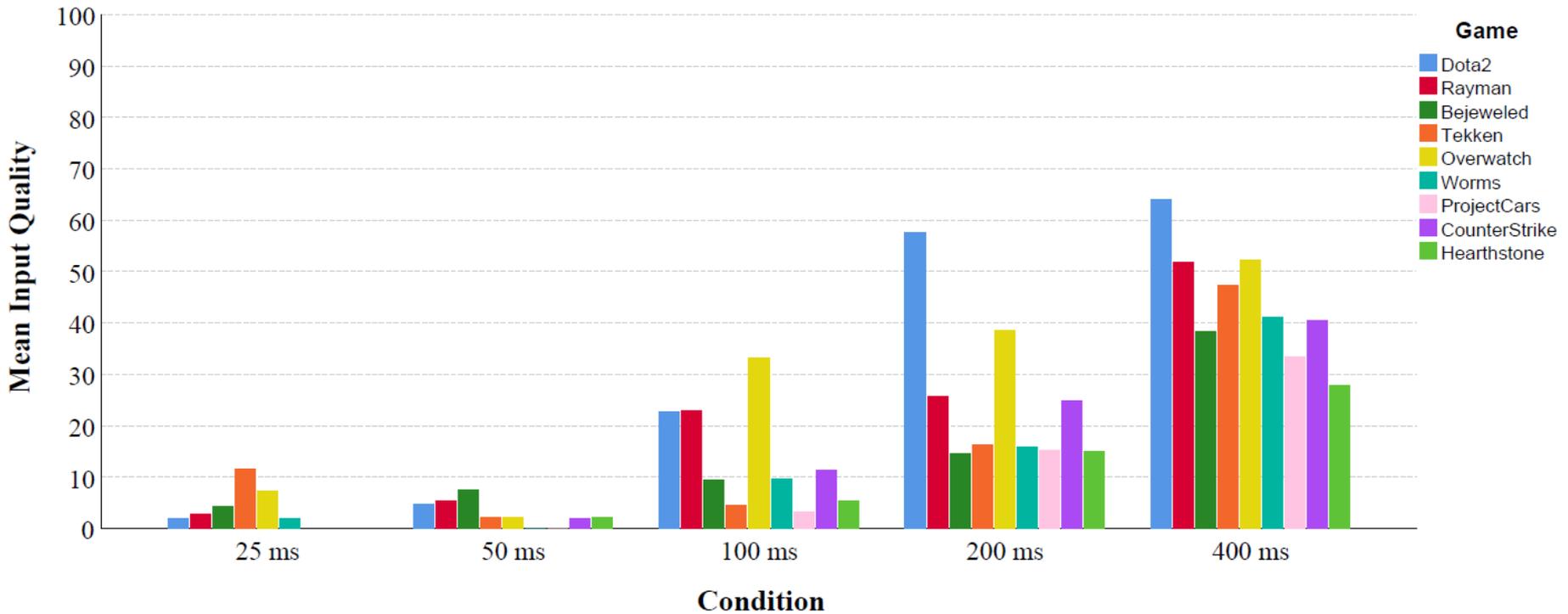
$$MOS_{norm,i} = \frac{MOS_i - 1}{MOS_{max} - 1} \cdot 3.5 + 1$$

3. Calculation of R-value according to ITU-T Rec. 107
4. Calculation of Impairment (differential R-values from reference):

$$I_{factor}(condition) = R_{max,factor} - R_{factor}(condition)$$

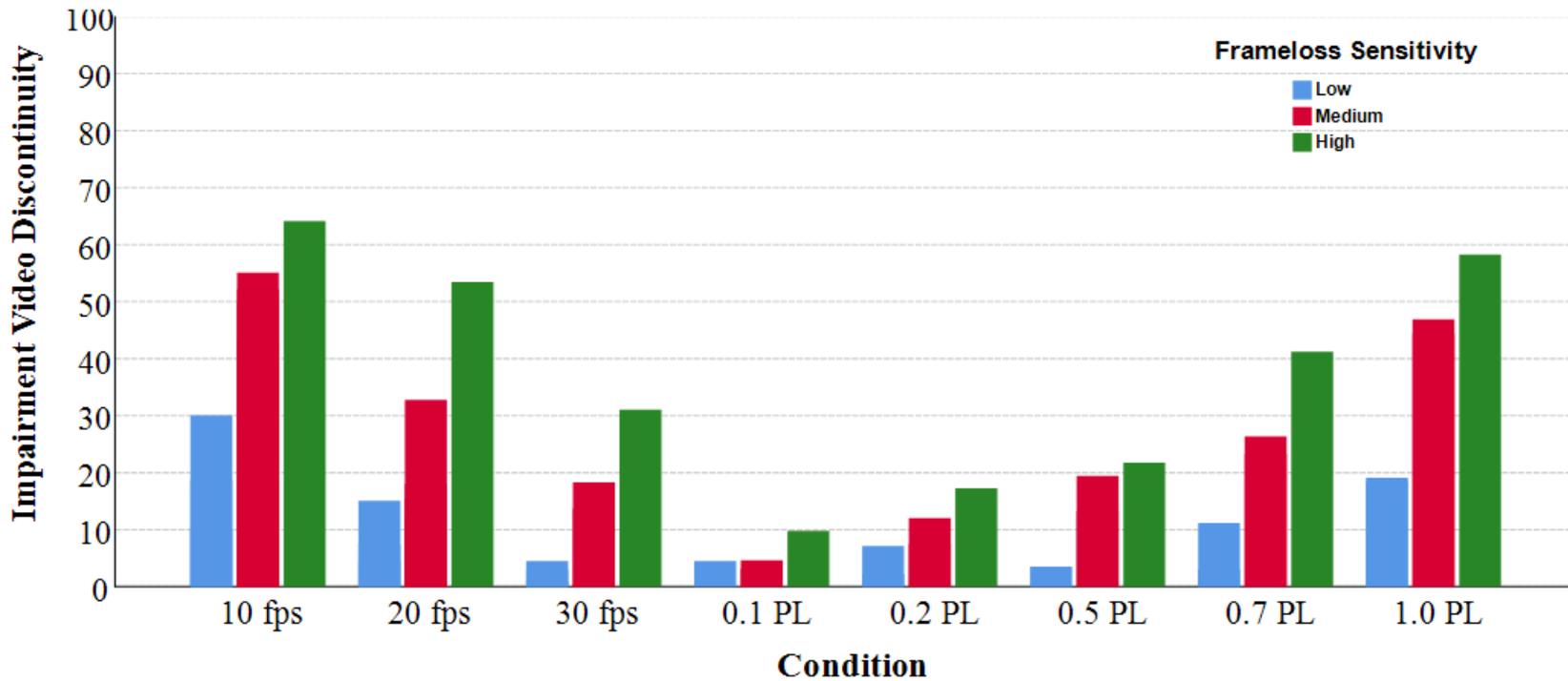


## Impact of network delay



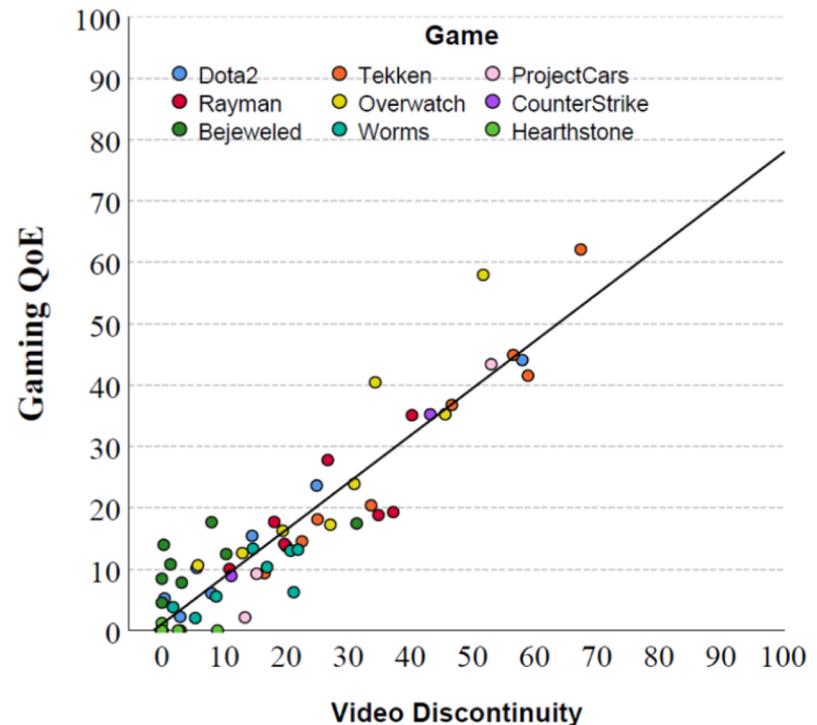
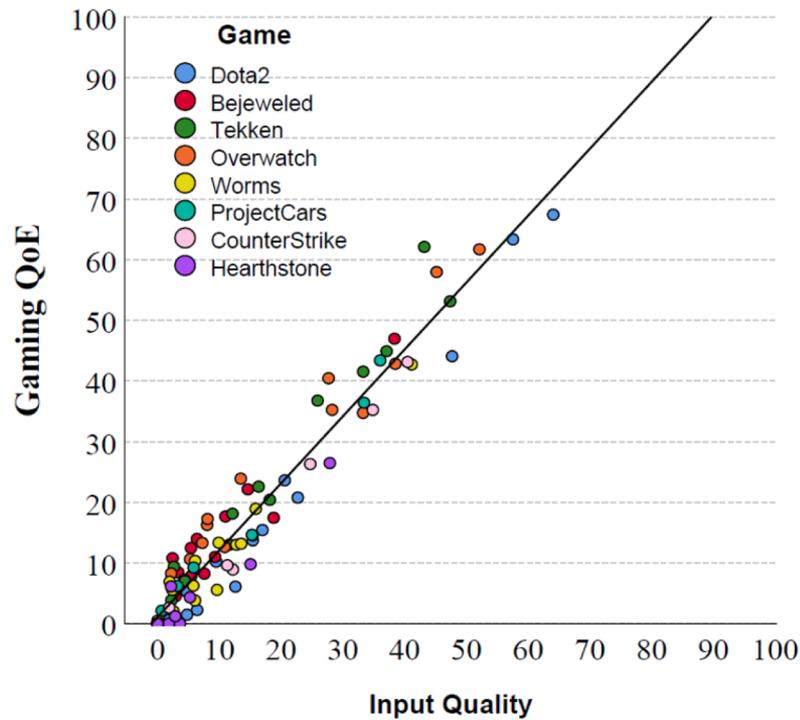


## Impact of network delay





# Suitability of quality aspects for prediction





## Impairment Factors

$$R_{\text{QoE}} = R_{\text{max,QoE}} - a \cdot I_{VQ_{\text{trans}}} - b \cdot I_{VQ_{\text{cod}}} - c \cdot I_{TVQ} - d \cdot I_{IPQ_{\text{delay}}} - e \cdot I_{IPQ_{\text{frames}}}$$

- $R_{\text{max, QoE}} = 100$
- $I_{VQ_{\text{trans}}}$  : video quality impairment factor for video transmission errors
- $I_{VQ_{\text{cod}}}$  : video quality impairment factor for video compression artefacts
- $I_{TVQ}$  ITVQ : Temporal Video Quality (discontinuity) caused by low encoding framerates (FR\_enc) or frame losses due to packet loss
- $I_{IPQ_{\text{delay}}}$  : Input Quality caused by network delay, and
- $I_{IPQ_{\text{frames}}}$  : Input Quality caused by low encoding framerates (FR\_enc) or frame losses due to packet loss.



# Modeling of Impairment Factors

Average displayed frame per second

Has to be updated as also bitrate and delay are important

$$Avg_{FPS} = FR_{enc} \cdot \exp\left(\left(f1 + \frac{f2}{FR_{enc}}\right) \cdot PL\right)$$

Avg\_FPS values for different encoding framerates and packet loss rates

| FR_enc [fps] | 60  | 30 | 20 |
|--------------|---|----|----|
| PL [%]       | Average Displayed Frames per Second [fps] |    |    |
| 0            | 60  | 30 | 20 |
| 0.1          | 55  | 28 | 19 |
| 0.2          | 50  | 26 | 18 |
| 0.4          | 42  | 23 | 16 |
| 0.5          | 39  | 21 | 15 |
| 0.7          | 32  | 18 | 14 |
| 1            | 25  | 15 | 12 |
| 2            | 10  | 8  | 7  |



## Video Model

- The video quality is estimated based on G.1071 prediction for Transmission Impairment and Coding Impairment

$$\begin{aligned} I_{VQ_{cod}} & \left\{ \begin{aligned} I_{VQ_{cod}} &= a_{1V} \cdot \exp(a_{2V} \cdot BitPerPixel) + a_{3V} \cdot ContentComplexity + a_{4V} \\ ContentComplexity &= a_{31} \cdot \exp(a_{32} \cdot BitPerPixel) + a_{33} \\ BitPerPixel &= \frac{Bitrate \cdot 10^6}{NumPixelPerFrame \cdot Framerate} \end{aligned} \right. \\ I_{VQ_{Trans}} & \left\{ \begin{aligned} I_{VQ_{trans}} &= c_{1V} \cdot \log(c_{2V} \cdot LossMagnitudeE + 1) \\ LossMagnitudeE &= q_1 \cdot \exp(q_2 \cdot LossMagnitudeNP) - q_1 \end{aligned} \right. \end{aligned}$$



## Impairment on Temporal Video Quality

- For the impairment factor  $I_{TVQ}$  the parameters Average displayed frame per second ( $Avg\_FPS$ ) and encoding framerate ( $FR\_enc$ ) were used:

$$I_{TVQ} = d_1 + d_2 \cdot \exp\left(\frac{1}{Avg_{FPS}}\right) + d_3 \cdot \exp\left(\frac{1}{FR_{enc}}\right) + d_4 \cdot Avg_{FPS} + d_5 \cdot FR_{enc}$$

- The performance of the impairment factor  $I_{TVQ}$  on the training dataset

|             | Low complex class | Medium complex class | High complex class |
|-------------|-------------------|----------------------|--------------------|
| <b>RMSE</b> | 4.00              | 8.084                | 3.528              |
| <b>PLCC</b> | 0.887             | 0.889                | 0.986              |



## Impairment on Input Quality

- Delay Impairment on Input Quality:

$$I_{IPQ_{Delay}} = \frac{d_1}{1 + \exp(d_2 - d_3 \cdot Delay)} - d_4$$

- Frame Loss Impairment on Input Quality:

$$I_{IPQ_{Frames}} = \frac{e_1}{\exp(e_2 \cdot Avg_{FPS})} + e_3 \cdot FrameLossRate$$

$$FrameLossRate = \frac{FR_{enc} - Avg_{FPS}}{FR_{enc}} \cdot 100$$



## G.OMG Core Model

- It turned out that the temporal video quality impairment factor  $I_{TVQ}$  does not contribute to the model. Thereby, the following model equation remained:

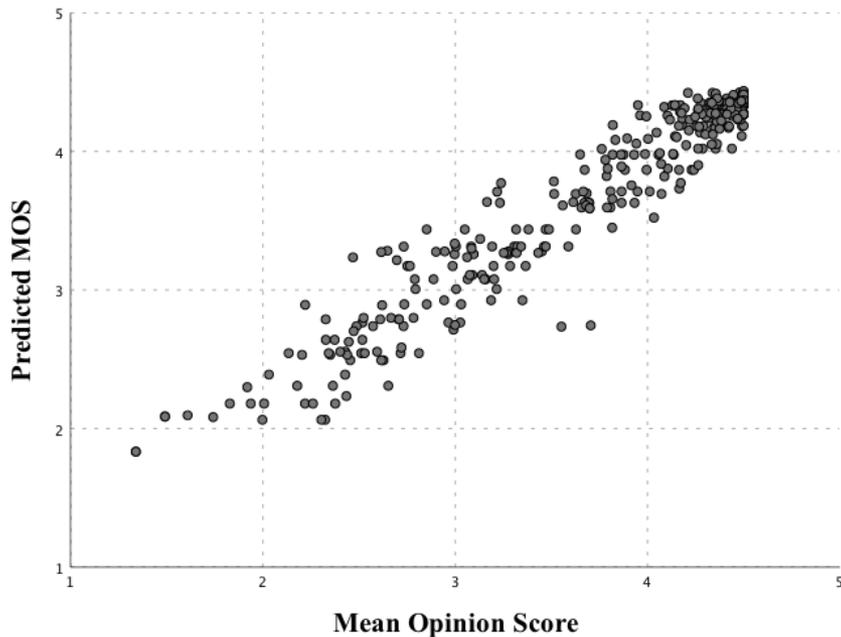
$$R_{QoE} = R_{max,QoE} - a \cdot I_{VQ_{trans}} - b \cdot I_{VQ_{cod}} - c \cdot I_{IPQ_{delay}} - d \cdot I_{IPQ_{frames}}$$

| Coefficient | $a$   | $b$   | $c$   | $d$   |
|-------------|-------|-------|-------|-------|
| Value       | 0.923 | 0.922 | 1.036 | 0.966 |

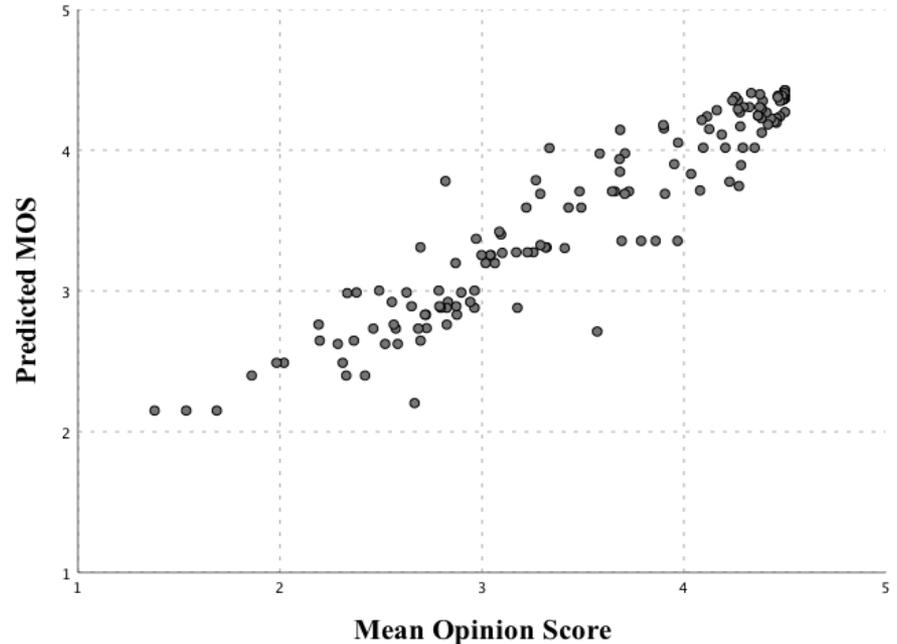


Very good performance IF the content classifications are applied:  
RMSE of 0.292 and PLCC of 0.94

# Scatter Plots



Scatter plot of MOS ratings of training dataset and predicted gaming QoE ratings on MOS scale



Scatter plot of MOS ratings of test dataset and predicted gaming QoE ratings on MOS scale



## Remaining challenges

- Input are system influence factors, potentially augmented by human and context influence factors
- Game characteristics largely determine the impact of system influence factors
- Parametric description of game characteristics missing
- Combination with Online Gaming missing
- Fast development of cloud gaming systems
  - Individual network protocols (packet loss influence)
  - Different compression methods (e.g. AV1)



# Thank you for your Attention!

Updates on the ITU-T Activities with  
Respect to Gaming Quality Assessment

Steven Schmidt

We are always searching for collaborations 😊

Visit

[www.qu.tu-berlin.de](http://www.qu.tu-berlin.de)

for more information.





# References

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- [3] International Telecommunication Union, Study Group 12 (Source: TU Berlin), "ITU-T Contribution SG12-C387: First Draft for an Opinion Model Predicting Gaming QoE (G.OMG)", Geneva, 2019.
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- [5] F. Schiffner and S. Möller, "Direct Scaling & Quality Prediction for perceptual Video Quality Dimensions," in 2018 Tenth International Conference on Quality of Multimedia Experience (QoMEX), 2018.
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