# Multi-episodic Perceived Quality of Telecommunication Services

**Dennis Guse, M. Sc.** | 2016-09-01

## **Outline**

## 1. Introduction

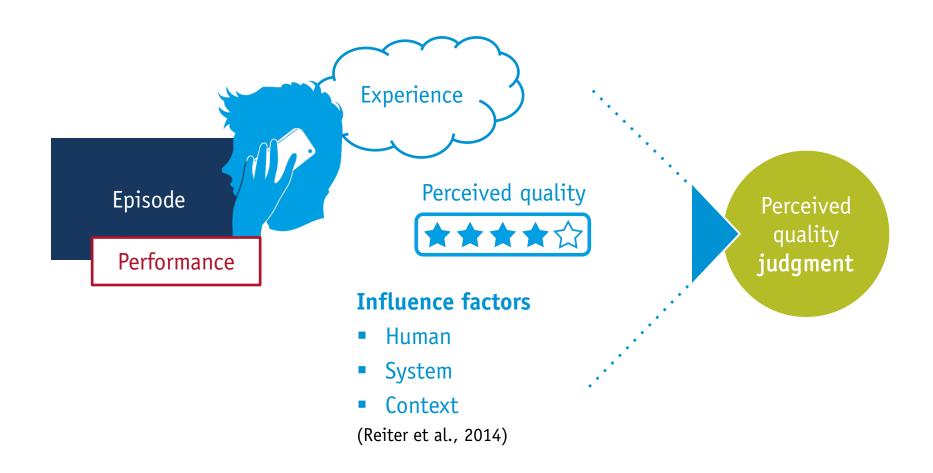
- 1. Perceived quality
- 2. Research question and goals
- 3. Research method

## 2. Experiments

- 1. Experimental design
- 2. Results
- 3. Prediction

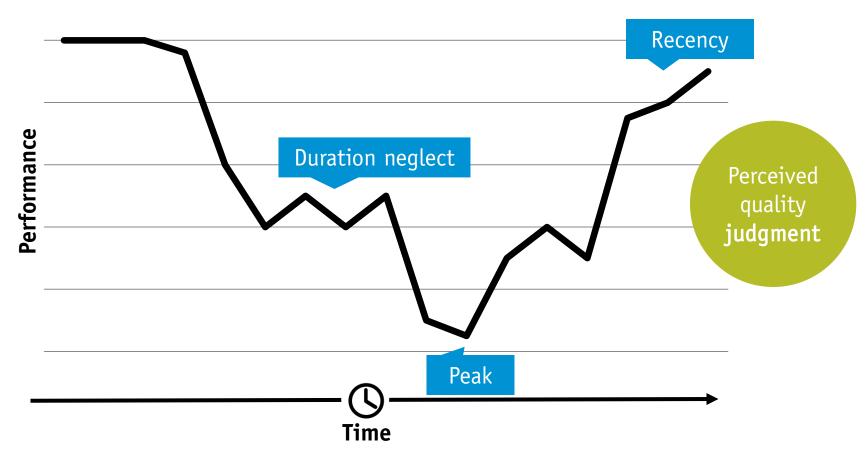
## 3. Conclusion and outlook

# **Perceived Quality**

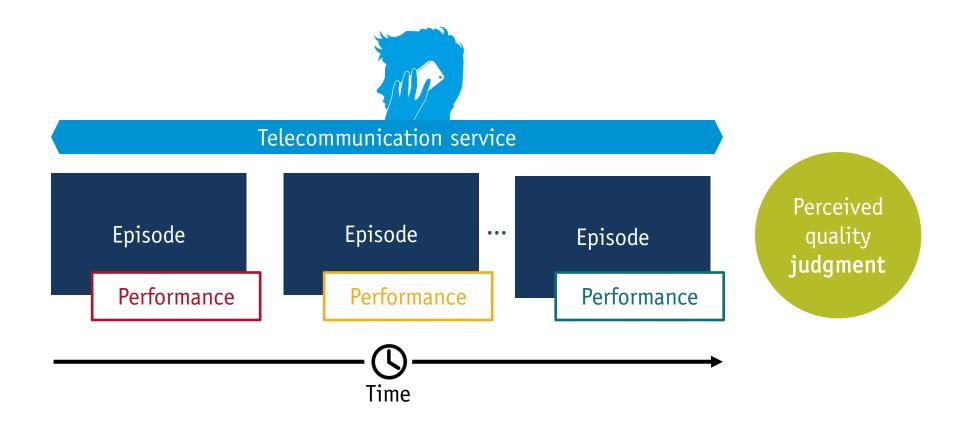


# **Retrospective Judgments**

## Example of for one experience



# Multi-episodic Perceived Quality



## **Research Question**

### **Research Question:**

How does *multi-episodic perceived quality* evolve over several, distinct usage episodes with a single telecommunication service?

## Usage episode as ...

» distinct, meaningful, and self-contained interaction by a user with a telecommunication service to achieve his goal(s) «



based upon episodic memory

## **Research Goals**



• to investigate how the <u>performance</u> of *a sequence of usage episodes* determines judgments of multi-episodic perceived quality



to investigate how <u>multi-episodic judgments</u> can be *predicted*

## The Defined-use Method



## #1: Investigate the formation process of multi-episodic judgments

First applied by Möller et al. (2011)

- 12 days
- 5 Multi-episodic conditions
- Video telephony (Skype)

### **Defined-use method**

- create <u>multi-episodic conditions</u> by defining each usage episode:
  - when, how, and what
  - performance



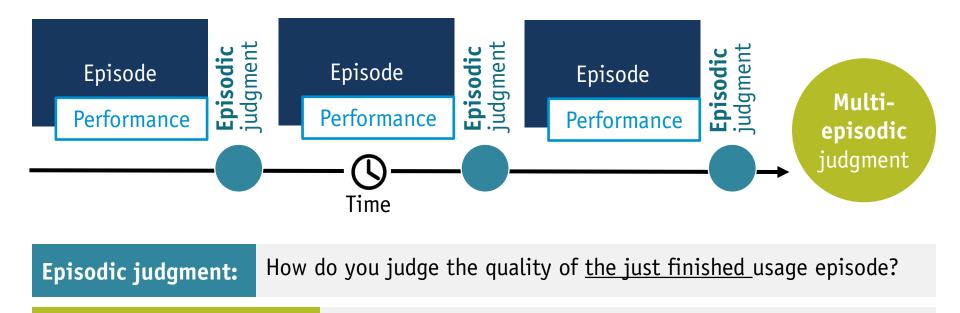
 repeatable conditions: enables to derive a Mean Opinion Score (MOS)

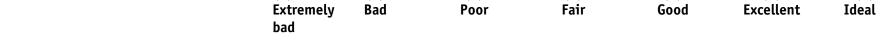


- unrealistic
- technically and organizationally challenging

# **Judgments**

Multi-episodic judgment:





(2)

(1)

How do you judge the quality of all usage episodes so far?

(3)

(4)

(0)

(6)

(5)

# **Empirical Investigation**

## Applying the defined-use method:

- task-driven usage
- constant performance per usage episode
- first usage episodes in best performance
- speech-only service
- new service

## **Aspects**

## **Usage periods**

- continuous use (1h)
- distributed use (6 days)

## **Service types**

- speech telephony
- audio book

## **User behavior**

- conversation
- listening / consumption

# **Experimental Design**

## **Usage Period: 1h**

- 6 usage episodes
- multi-episodic judgment after the 3<sup>rd</sup> and 6<sup>th</sup> usage episode



task: conversation (ITU-T P.805)



task: consume recordings (ITU-T P.805)

E3: Audio book (3min)

task: consume content

## **Usage Period: 6 days**

- 2 usage episodes per day
- multi-episodic judgment after the 3<sup>rd</sup> and 6<sup>th</sup> day

E6: Audio book (12-17min)

task: consume content

**Performance levels: \( \Lambda\) High Performance (HP):** G.722 and CD

**▼ Low Performance** (LP): LPC-10

# **Empirical Results**



## Reported as MOS



## **Participants**

E1: 129

E2a: 115

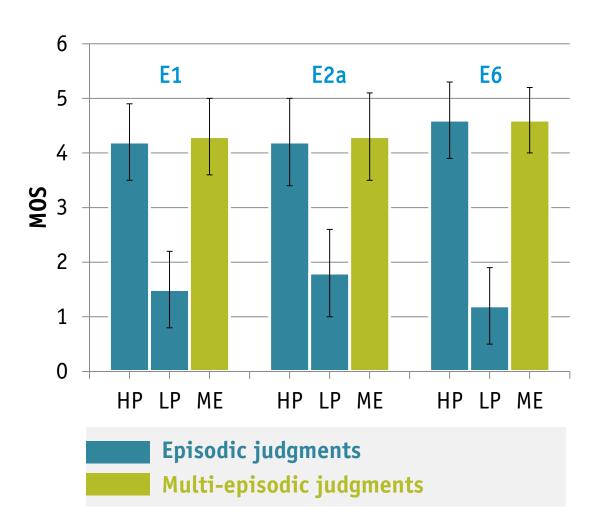
E3: 36

E6: 94

german speaking younger than 35 mainly students



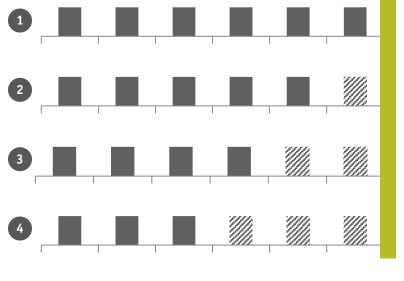
3 of 8 hypotheses

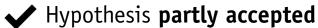


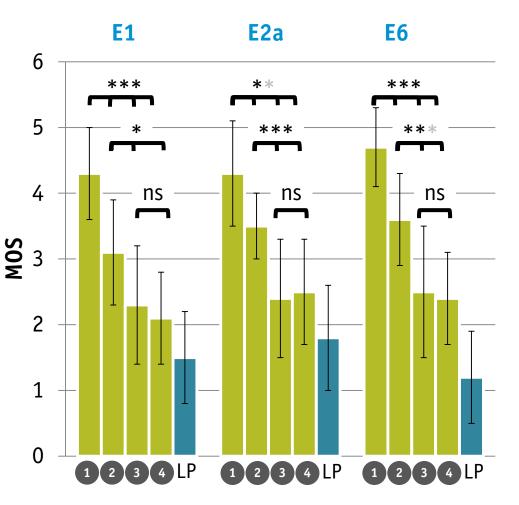
# **Hypothesis 1: Number of LP Episodes**

## **Hypothesis:**

Increasing the number of LP episodes before a multi-episodic judgment decreases this judgment.



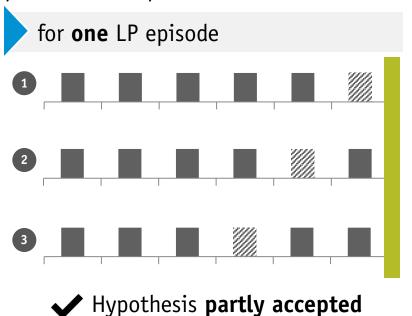


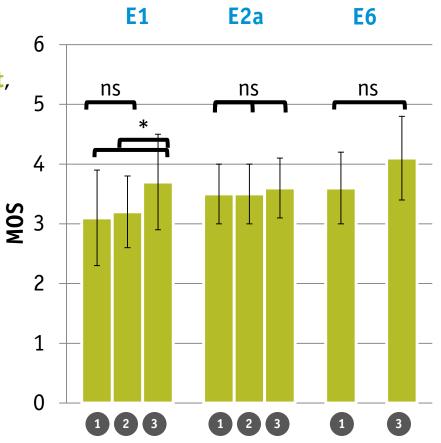


# Hypothesis 2: Position of LP Episodes (1)

## **Hypothesis:**

The more HP episodes are presented directly before a multi-episodic judgment, the lower is the negative impact of earlier presented LP episodes.

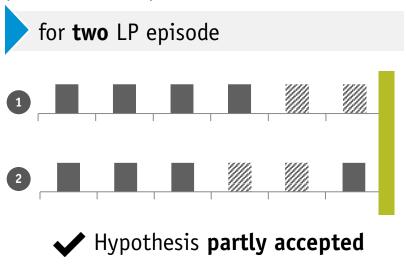


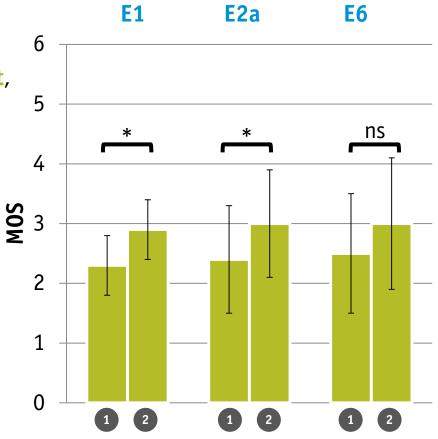


# Hypothesis 2: Position of LP Episodes (2)

## **Hypothesis:**

The more HP episodes are presented directly before a multi-episodic judgment, the lower is the negative impact of earlier presented LP episodes.



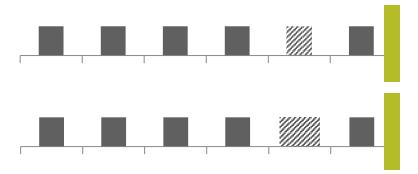


# **Hypothesis 6: Duration of LP Episodes**

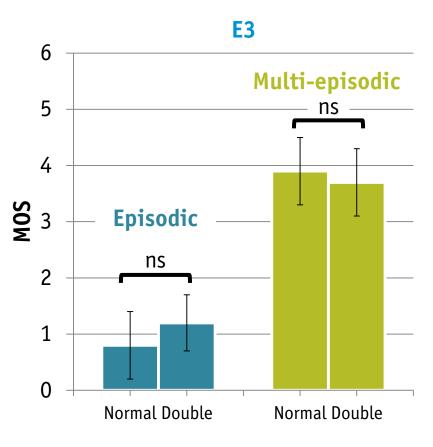
## **Hypothesis:**

LP episodes with a much longer duration result in a higher reduction of multi-episodic judgments than shorter LP episodes.

doubled duration of one LP episode







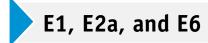
# Prediction of Multi-episodic MOS



Predict multi-episodic MOS  $(\hat{m}_n)$ based upon episodic MOS  $(e_i)$  of all prior usage episodes.

## Observed effects:

- duration neglect
- position of LP episodes
- number of LP episodes
- **saturation**





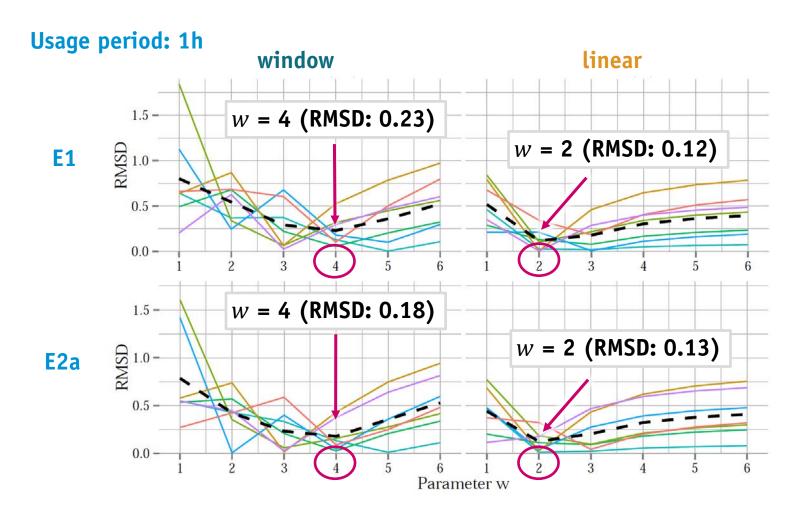
## Weighted average

$$\widehat{\boldsymbol{m}}_{n} = \frac{\sum_{i=1}^{n} a_{i} * \boldsymbol{e}_{i}}{\sum_{i=1}^{n} a_{i}}$$

Weight functions:  $a_i$ 

- **Parameter**  $w: 1 \le w \le n$
- window linear

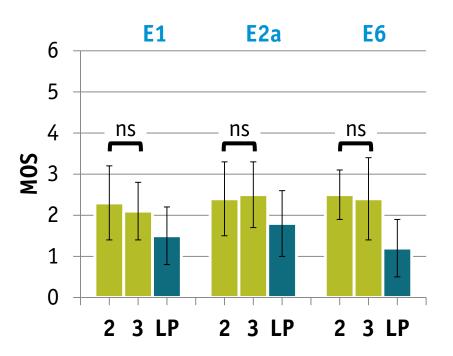
# Prediction: $m_6$ (E1 and E2a)



## **Prediction: Saturation**

### Saturation observed:

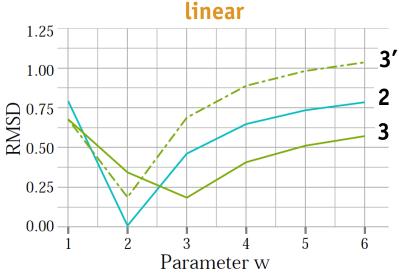
Two and three LP episodes result in a very similar multi-episodic MOS



### **Solution:**

Modify 3 with:

3': 
$$e_4 \coloneqq \overline{e_{HP}}$$



# **Summary and Discussion**

- #1 Formation process of multi-episodic judgments
  - service initially well-working
  - severe degradations
  - usage periods: 1h and 6 days
  - speech-only services
  - impact of number
    - saturation
  - impact of position
  - duration neglect



# **#2 Develop simple, sufficient prediction models**

- weighted average
- compensation for saturation

## **|||||||** Limitations

- MOS: average person
- sampling of participants
- unrealistic performance

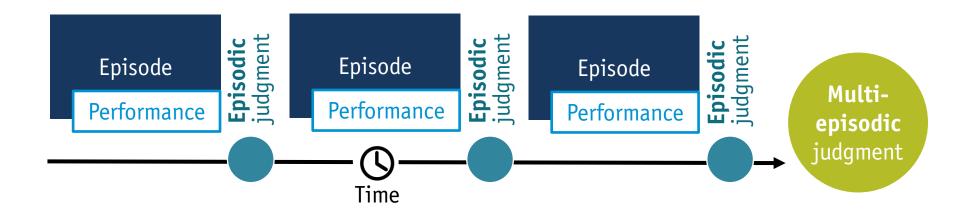
## **Future Work**



### **Future Work**

- non-regular use
- impact of episodic judgments
- within episode performance changes
- importance tasks
- verify findings without defined-use method

# Multi-episodic Perceived Quality





## References

Möller, Sebastian, Bang, Chihuy, Tamme, Teele, Vaalgamaa, Markus, and Weiss, Benjamin (2011). "From Single-all to Multi-Call Quality: A Study on Long-term Quality Integration in Audio-Visual Speech Communication." In: 12th Annual Conference of the International Speech Communication Association. INTERSPEECH. Florence, Italy: ISCA, pp. 1485–1488.

**Raake, Alexander and Egger, Sebastian (2014)**. "Quality and Quality of Experience." In: Quality of Experience. Ed. by Sebastian Möller and Alexander Raake. Springer International Publishing, pp. 11–33. isbn: 978-3-319-02681-7

Reiter, Ulrich; Brunnström, Kjell; De Moor, Katrien; Mohamed-Chaker, Larabi; Pereira, Manuela, Pinheiro, Antonio; You, Jungyong and Zgank, Andrej (2014). "Factors Influencing Quality of Experience." In: Quality of Experience. Ed. by Sebastian Möller and Alexander Raake. Springer International Publishing, pp. 55–72. isbn: 978-3-319-02681-7

### My Publications

**Guse, Dennis and Möller, Sebastian (2013)**. "Macro-temporal Development of QoE: Impact of Varying Performance on QoE over Multiple Interactions." In: Proceedings of AIA-DAGA Conference on Acoustics. Vol. 46. Merano, Italy: Deutsche Gesellschaft für Akustik, pp. 452–455.

**Guse, Dennis, Weiss, Benjamin, and Möller, Sebastian (2014)**. "Modelling multi-episodic quality perception for different telecommunication services: First insights." In: Sixth International Workshop on Quality of Multimedia Experience (QoMEX). Singapore. IEEE, pp. 105–110.

Weiss, Benjamin; Guse, Dennis; Möller, Sebastian; Raake, Alexander; Borowiak, Adam and Reiter, Ulrich (2014). "Temporal Development of Quality of Experience." In: Quality of Experience. SpringerInternational Publishing, pp. 133–147. isbn: 978-3-319-02681-7.

**Guse, Dennis; Wunderlich, Anna; Weiss, Benjamin; Möller Sebastian** (2016). "Duration Neglect in Multi-episodic Perceived Quality". In: *Proc. International Conference on Quality of Multimedia Experience (QoMEX)*.

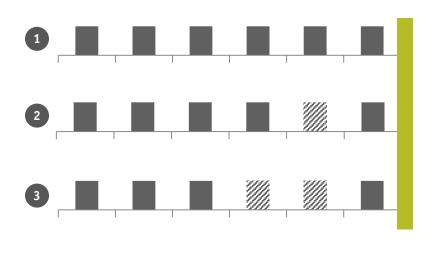
## **Performance Levels**

Performance Level	Signal Bandwidth	Codec	POLQA Estimation
High Performance (HP)	50700 Hz	G.722, Mode 1	4.0
Medium Performance (MP)	3003400 Hz	G.711	3.3
Low Performance (LP)	3003400 Hz	LPC-10	1.9

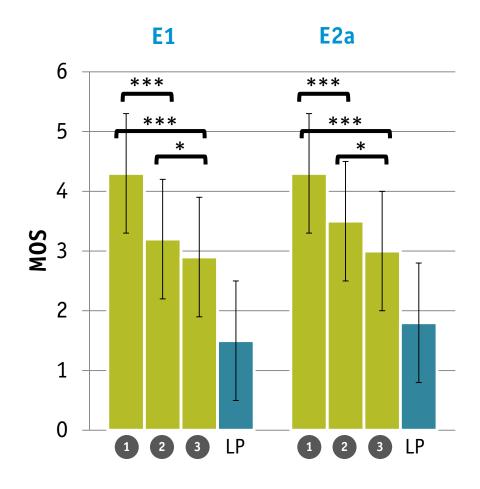
# Hypothesis 1: Number of LP Episodes (1)

## **Hypothesis:**

Increasing the number of LP episodes before a multi-episodic judgment decreases this judgment.



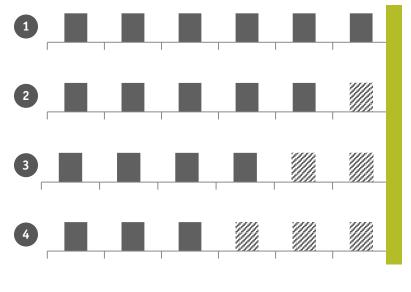
Hypothesis accepted



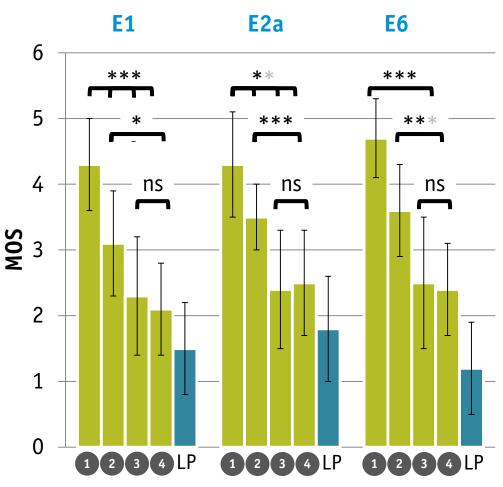
# Hypothesis 1: Number of LP Episodes (2)

## **Hypothesis:**

Increasing the number of LP episodes before a multi-episodic judgment decreases this judgment.



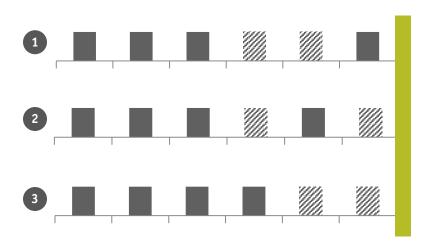




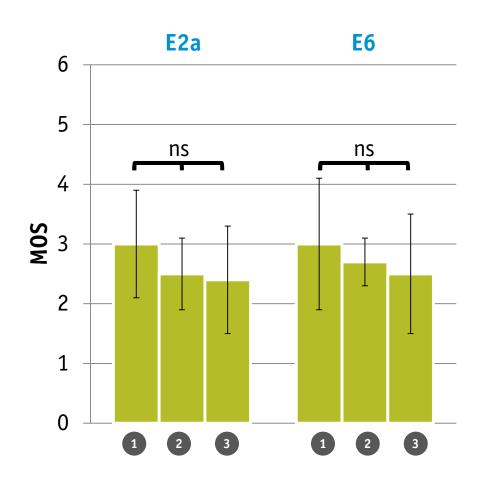
# Hypothesis 3: (Non)-Consecutive LP Episodes

## **Hypothesis:**

The presentation of non-consecutive LP episodes leads to a higher reduction of multi-episodic judgments than a consecutive presentation.



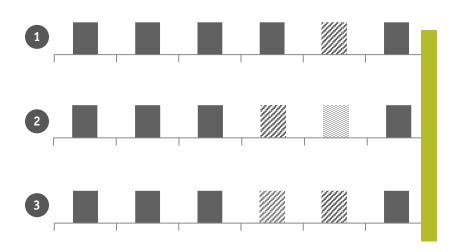


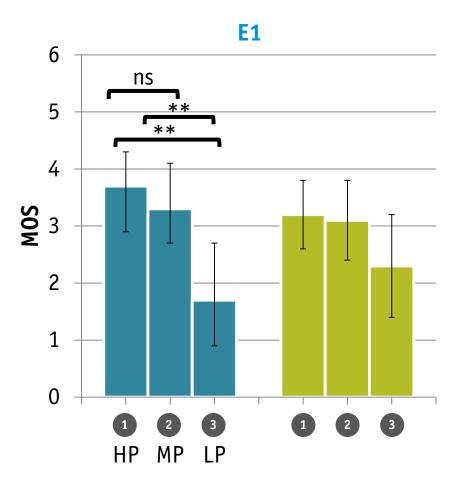


# Hypothesis 4: Strength of Degradation

## **Hypothesis:**

The lowest experienced episodic performance has an increased impact on multi-episodic judgments, whereas less severe degradations are less important.

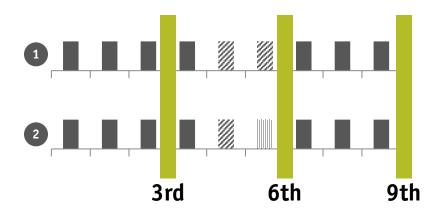




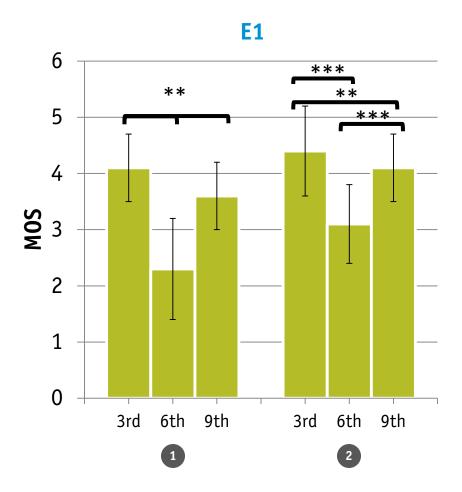
# **Hypothesis 5: Recovery**

## **Hypothesis:**

Presenting additional HP episodes after a negatively affected multi-episodic judgments results in an increase of the following multi-episodic judgment.





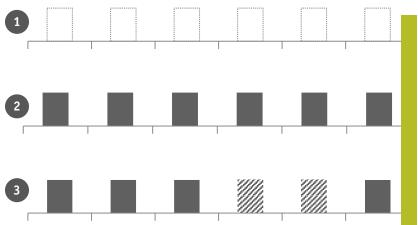


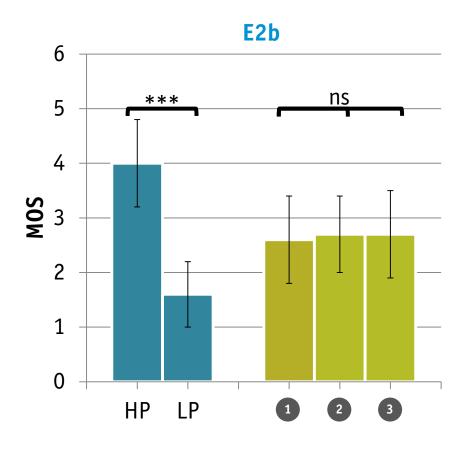
# Hypothesis 7: Impact of a 2nd Service

## **Hypothesis:**

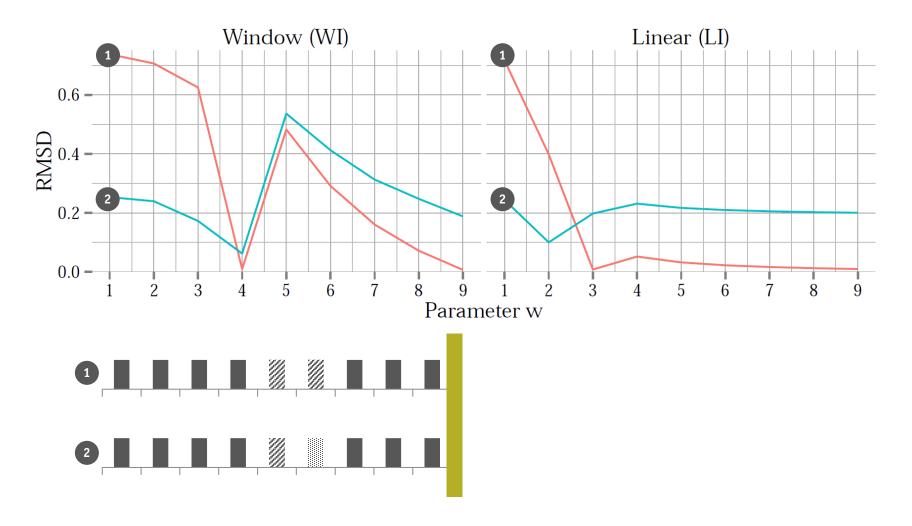
The multi-episodic judgment for one service is not affected by the presentation of a 2<sup>nd</sup> service in the same usage period.

Sequential use of two services



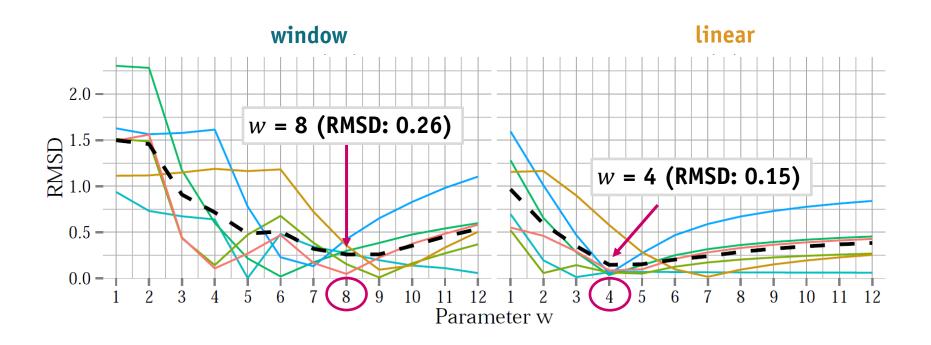


# Prediction: $m_9$ (E1)



# Prediction: $m_{12}$ (E6)

## Usage Period: 6 days (E6)



# Quality of Experience (Definition)

"Quality of Experience is the degree of delight or annoyance of a person whose experiencing involves an application, service, or system.

It results from the person's evaluation of the fulfillment of his or her expectations and needs with respect to the utility and/or enjoyment in the light of the person's context, personality and current state."

(Raake et al., 2014, p. 19)