



Innovations in Clouds,  
Internet and Networks

19<sup>th</sup>  
ICIN  
CONFERENCE

PARIS  
MARCH 1 - 3, 2016

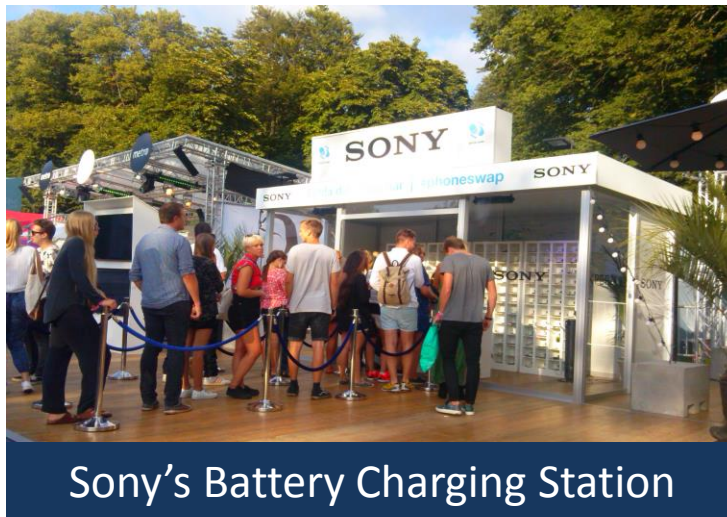
# Quality of Experience on Smartphones

## Network, Application, and Energy Perspectives

Selim Ickin & Markus Fiedler



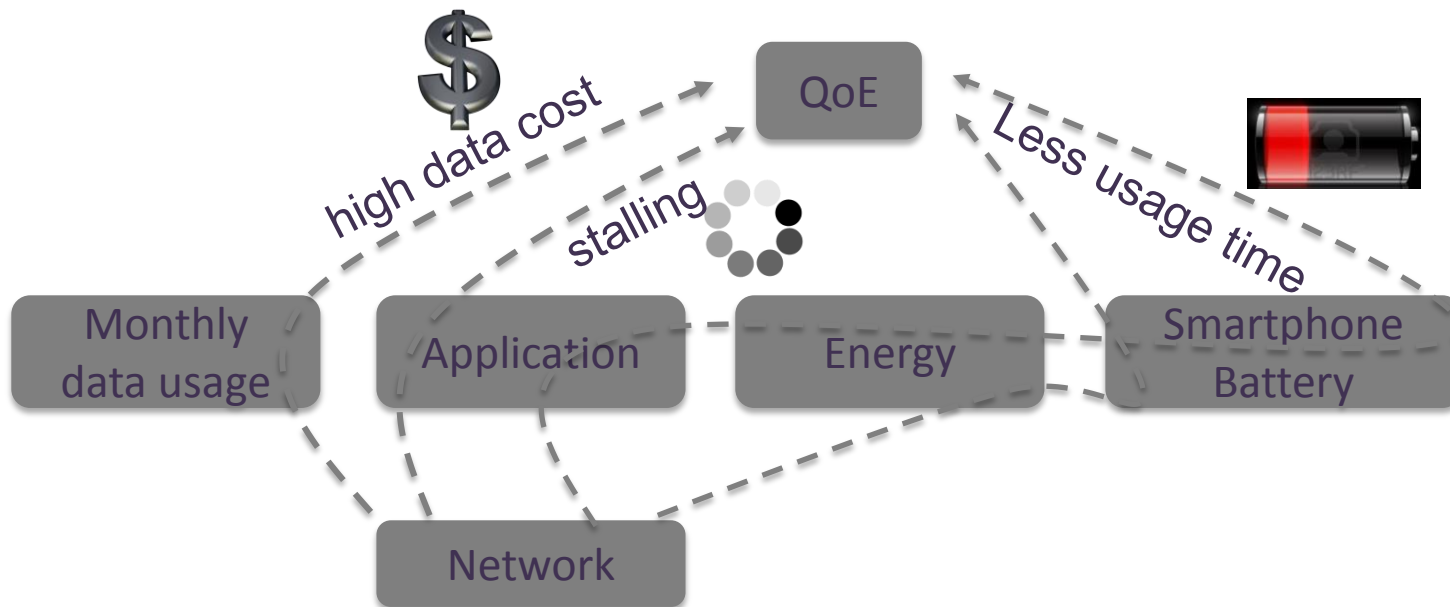
- Occasional stops while driving
  - both “annoying” and “fuel-consuming”
- Smartphone users in a music festival
  - high amount of application data traffic
  - application freezes, unresponsive apps
  - users crave for battery



Sony's Battery Charging Station



# Potential impacts of network distortions causing freezes



- Energy consumption
- Temporal impairments (freezes) in video

## Network

- Packet delay variation (PDV)
- Maximal Burst Size (MBS)

## Application

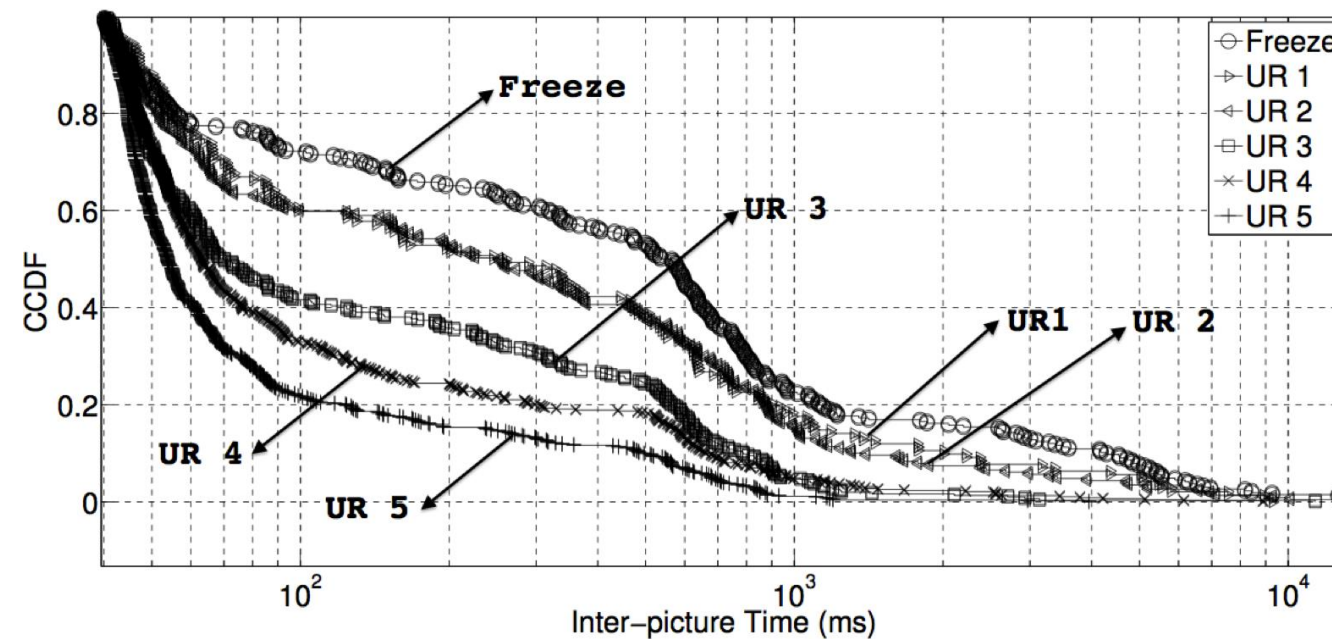
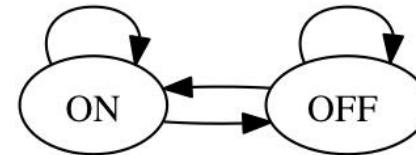
- Inter-picture time ( $D_p$ )
- User's quality indications
  - Mean Opinion Score (MOS)
  - Other quality indications (freeze, qualitative)

## Energy

- Power consumption ( $P_n$ )
- Duration ( $t$ )

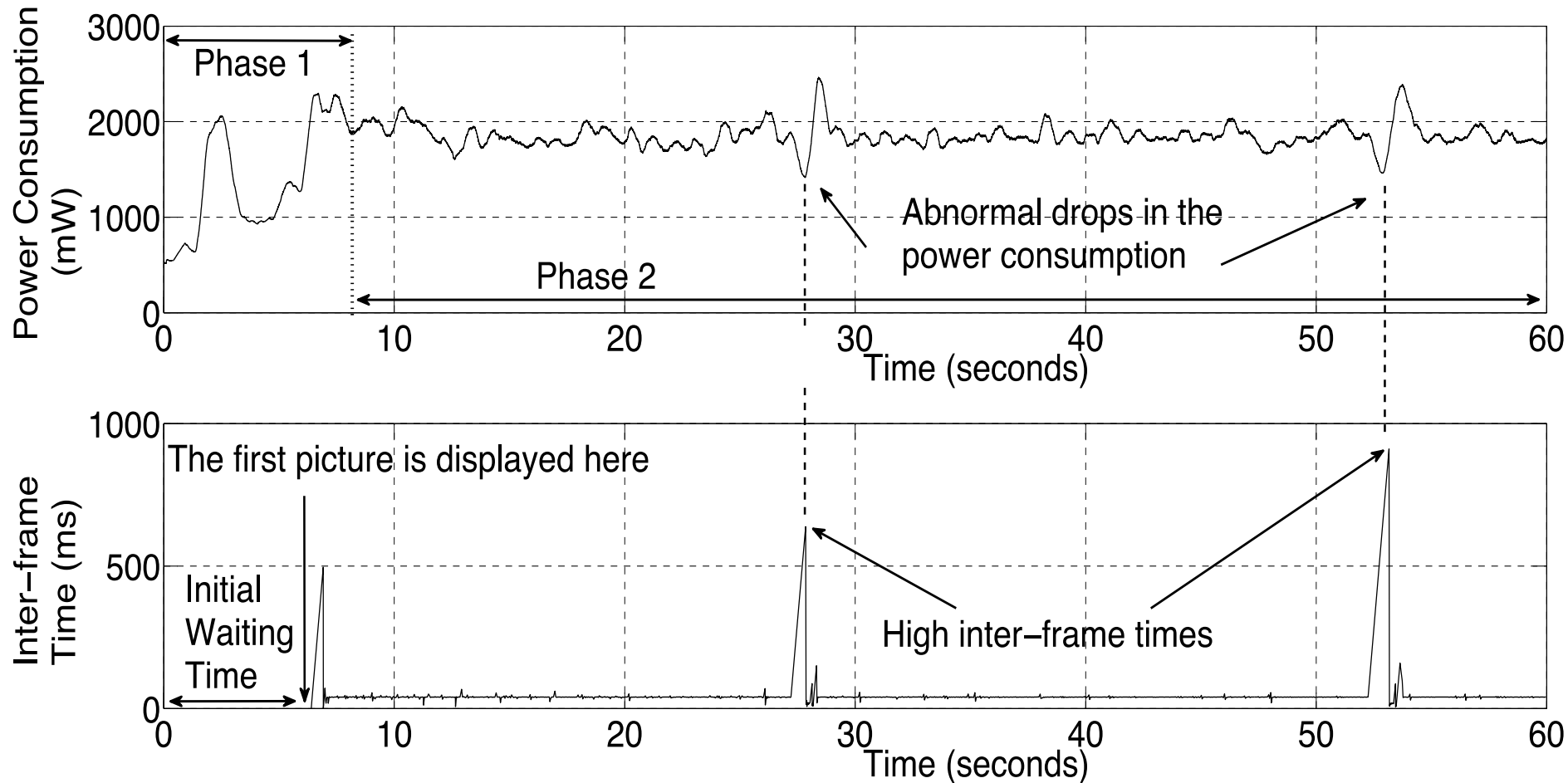


- Data ON duration
  - Mean ON duration = 9.7 s
- Data OFF duration
  - Mean OFF duration = 642 ms

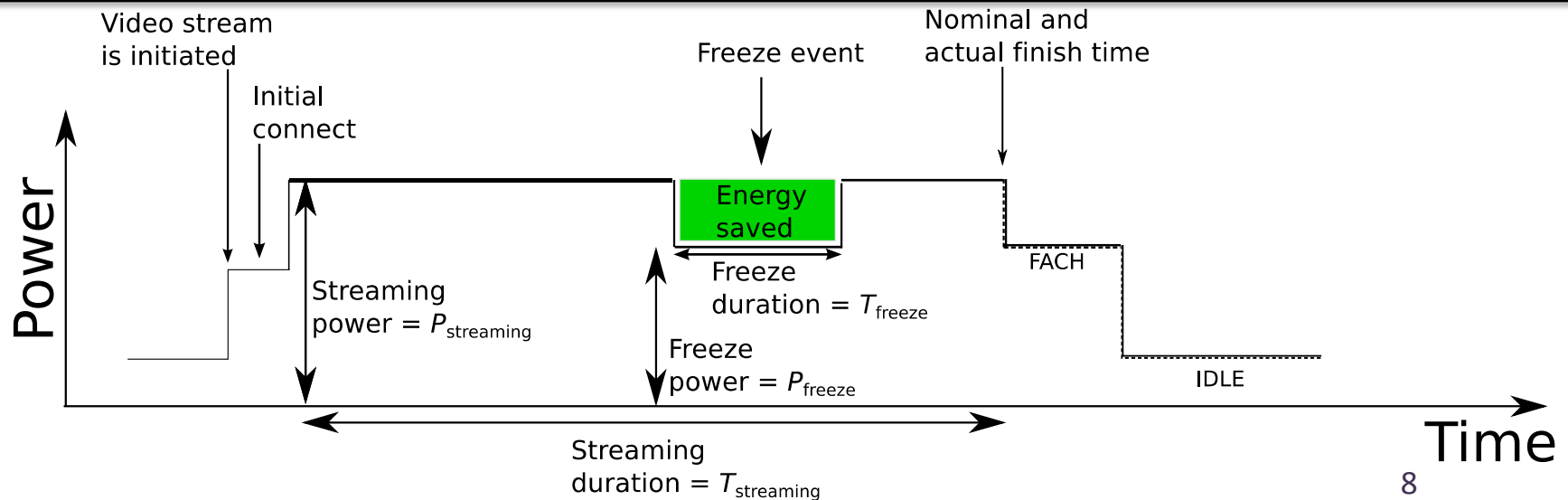
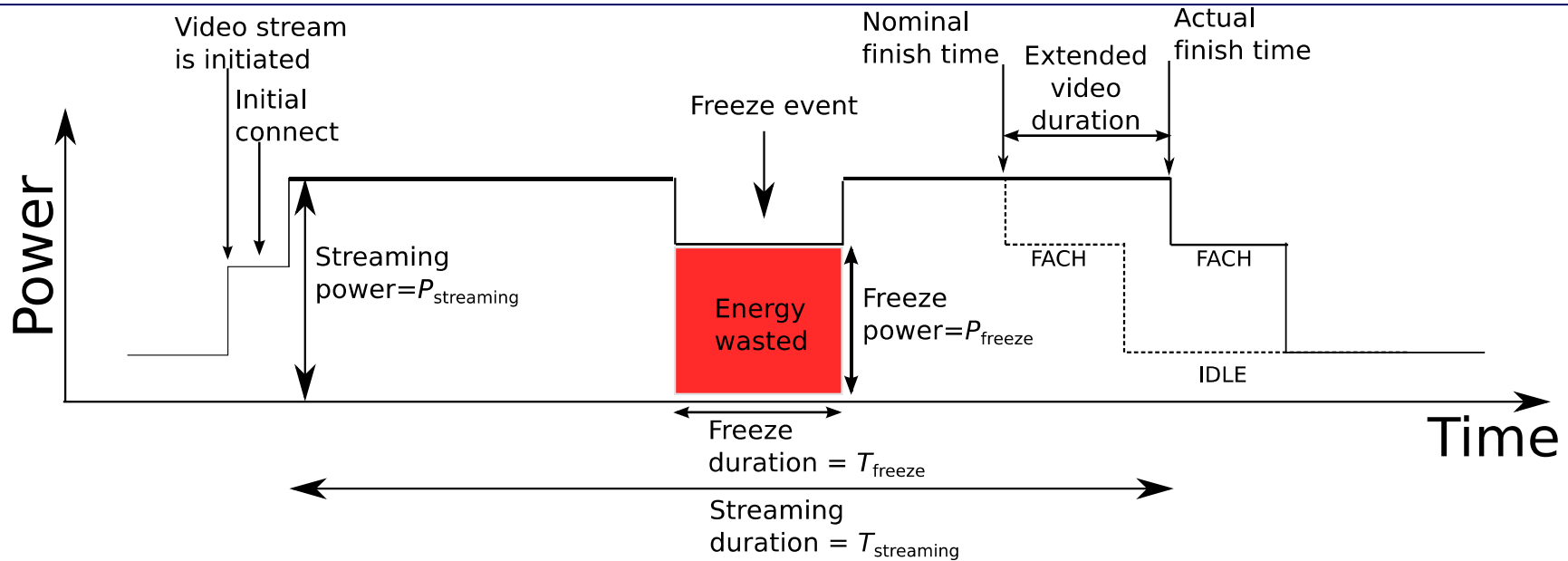


UR = 5	152 ms
UR = 4	282 ms
UR = 3	321 ms
UR = 2	768 ms
UR = 1	831 ms
Freeze	1289 ms

# Power consumption phases and inter-picture time [3]



# Video energy consumption [4]





- Network ( $PDV$  vs.  $MOS$ ) [5]
  - $UR = -9.10 (PDV_{EWMA}/ms)^{0.08} + 16.18; R^2 = 0.68$
  - $UR = -59.96 MBS_{[packets/ms]}^{-0.036} - 51.71; R^2 = 0.78$
- Application ( $P_{OFF}$  vs.  $MOS$ ) [4]
  - $MOS = 4.59 e^{-3.44 P_{OFF}}; R^2 = 0.73$
- Energy [4]

- If there are video jumps  
(such as in UDP-based streams),  
up to apprx. 5 J energy can be saved
- If there are no video jumps  
(such as in TCP-based streams),  
the higher the amount of freezes,  
the higher the energy consumption  
(and the more energy is wasted)

$$MOS = 4.59 e^{-18.59 \frac{E_{\text{saving}}/J}{T_{\text{video}}/s}}$$

$$MOS = 4.59 e^{-4.72 \frac{E_{\text{waste}}/J}{T_{\text{video}}/s}}$$

- Network
  - Maximal Burst Size (BS) and Packet Delay Variation (PDV) are strong indicators of QoE
  - A power-law model fits slightly better than an exponential model
  - Exponential weighted moving average improves the correlation (imitating human forget factor)
- Application
  - Two state ON / OFF exponential model applies to mobile video streaming
  - Obtained QoE model as exponential function of the OFF probability ( $P_{\text{OFF}}$ )
- Energy
  - QoE models above are leveraged to obtain MOS per joule
  - For TCP-based streams: better to avoid freezes to save energy!
  - For UDP-based streams: Some energy can be saved by skipping video content while keeping MOS untouched.

1. S. Ickin, K. Wac, M. Fiedler, L. Janowski, J. H. Hong, and A. K. Dey, “Factors influencing Quality of Experience of commonly-used mobile applications,” *IEEE Communications Magazine*, 50(4):48–56, 2012.
2. S. Ickin, M. Fiedler, K. Wac, P. Arlos, C. Temiz, K. Mkocha, “VLQoE: Video Quality of Experience Instrumentation on the Smartphone,” *Multimedia Tools and Applications. Special Issue on Advances in Tools, Techniques and Practices for Multimedia QoE*, Springer US, 74(2):381–411, 2014.
3. S. Ickin, M. Fiedler, K. Wac, “Energy-based anomaly detection in Quality of Experience,” in *Proc. 16th International Symposium on Wireless Personal Multimedia Communications (WPMC)*, pp 1–6, USA, 2013.
4. L.G. Ballesteros, S. Ickin, M. Fiedler, J. Markendahl, K. Tollmar, and K. Wac, “Energy Saving Approaches for Video Streaming on Smartphone based on QoE Modeling,” in *Proc. 13th IEEE Annual Consumer Communications & Networking Conference (CCNC)*, 2016.
5. S. Ickin, K. D. Vogeleer, M. Fiedler, D. Erman, “The effects of Packet Delay Variation on the perceptual quality of video,” in *Proc. IEEE 35th Conference on Local Computer Networks (LCN2010)*, pp 663–668, 2010.



Innovations in Clouds,  
Internet and Networks

19<sup>th</sup>  
ICIN  
CONFERENCE

PARIS  
MARCH 1 - 3, 2016

**Thank you!**

**#ICIN2016**



# User experiment procedure

Scenario 1 (S1): freeze with jump

Scenario 2 (S2): freeze without jump

Scenario 3 (S3): no freeze

IOVidEoQ Android tool

For the impairment scenario (S1 and S2),  
add exponentially distributed delays  
between pictures  
(mean ON = 8 s, mean OFF = 2s)

User  
Survey  
and  
Interview

Settings  
and  
Training

Select a random scenario and  
remove the selected scenario from the list

Display  
Video  
(3 minutes)

Rating  
(MOS)

Gray  
Screen  
(15 seconds)

If all  
scenarios  
are  
presented

Send data  
to FTP server

Experiments  
end

If there are  
unpresented scenarios

- 30 users, average age 29, 14 females, 3 countries
- S4 and Nexus 5, Super AMOLED, 16M colors, 1080 x 1920 pixels.