### How fast? How furious?

Real people Real optimizations



"Measuring QoE of Interactive Workloads and Characterising Frequency Governors on Mobile Devices."

**IISWC 2014** 

Volker Seeker, Pavlos Petoumenos, Hugh Leather and Bjorn Franke "Measuring QoE of Interactive Workloads and Characterising Frequency Governors on Mobile Devices."

**IISWC 2014** 

Volker Seeker, Pavlos Petoumenos, Hugh Leather and Bjorn Franke

"Refreshingly low on quantitative data"

"Measuring QoE of Interactive Workloads and Characterising Frequency Governors on Mobile Devices."

**IISWC 2014** 

**Volker Seeker**, Pavlos Petoumenos, Hugh Leather and Bjorn Franke

"Refreshingly low on quantitative data"







# Testing Evaluating Tuning





### Testing Evaluating Tuning

Comput. System





#### Testing Evaluating Tuning

Comput. System



Time Energy





Rinse and Repeat

Testing Evaluating Tuning

Comput. System



Time Energy



#### One size fits all?



#### One size fits all?

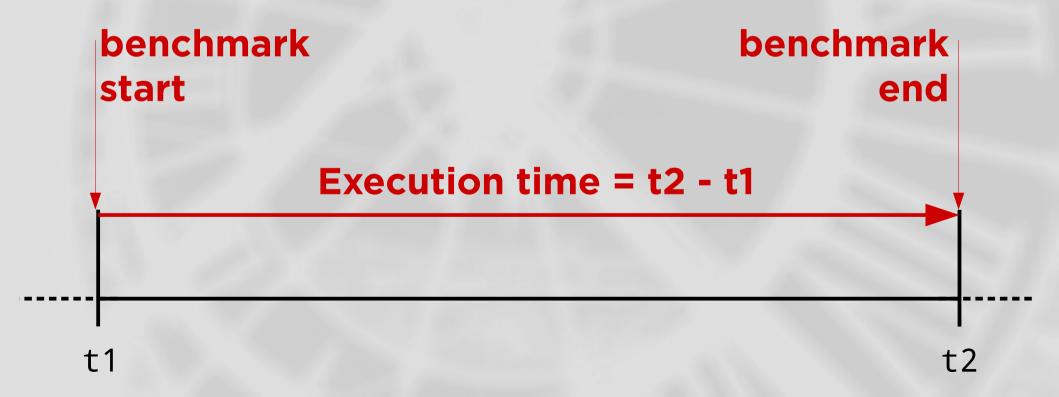


#### One size fits all?

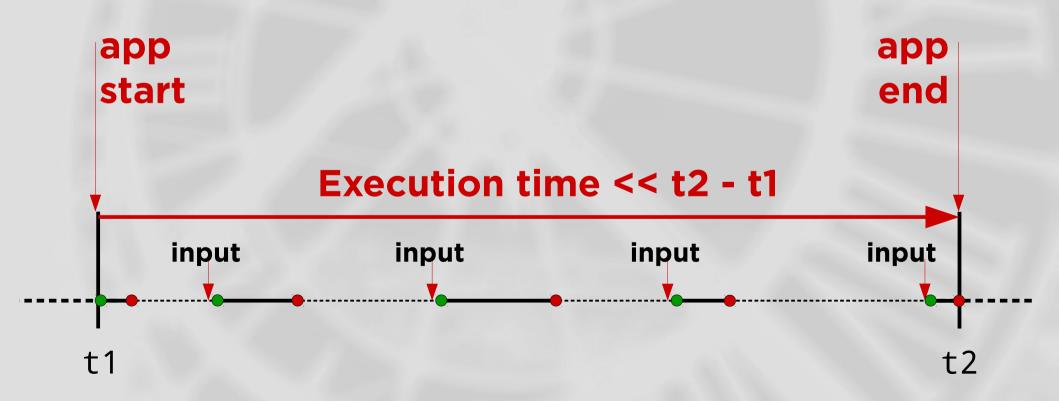


## What does the user really care about?

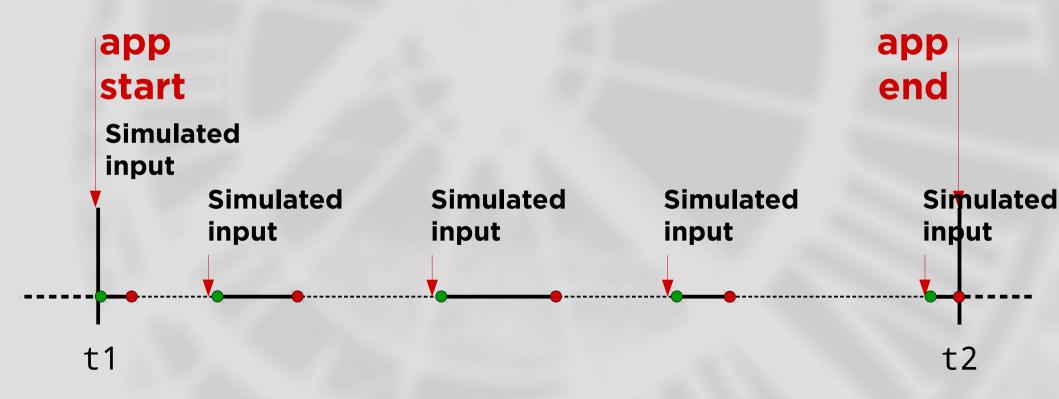
#### **Standard Benchmarks**



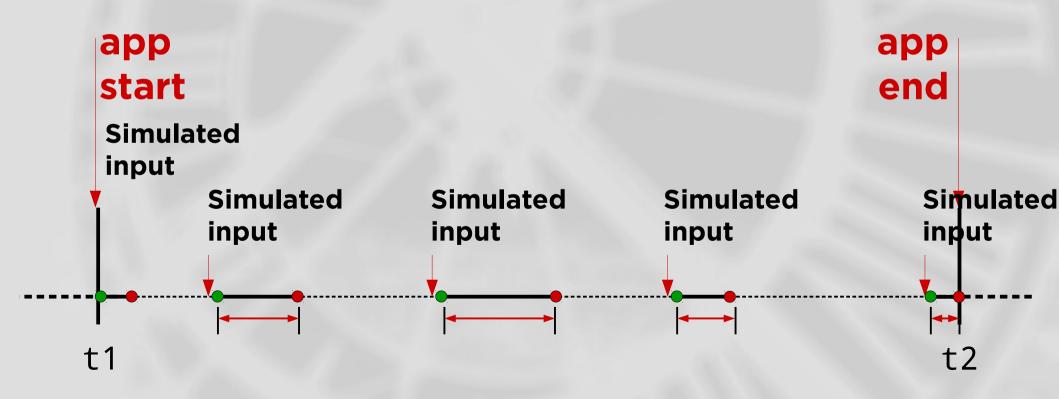
#### Mobile apps



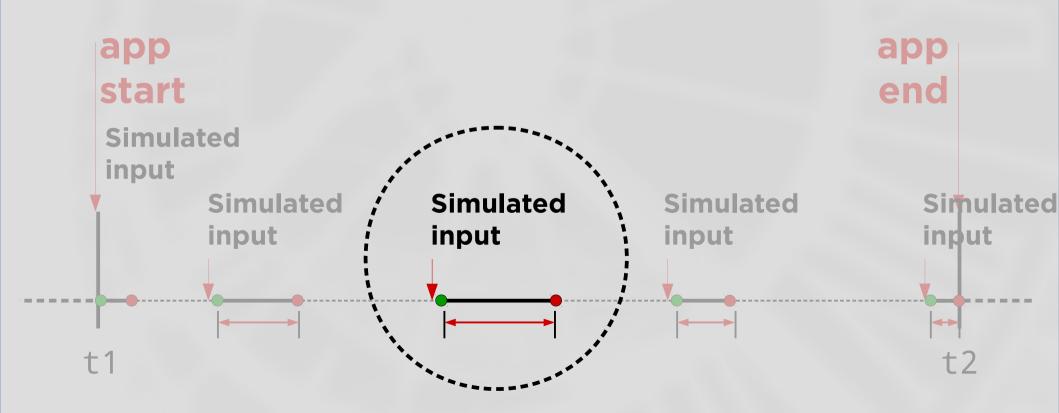
#### Input Replay



#### **Input Replay**



#### Input Replay





### What does the user care about?





## What does the user care about?



1/0



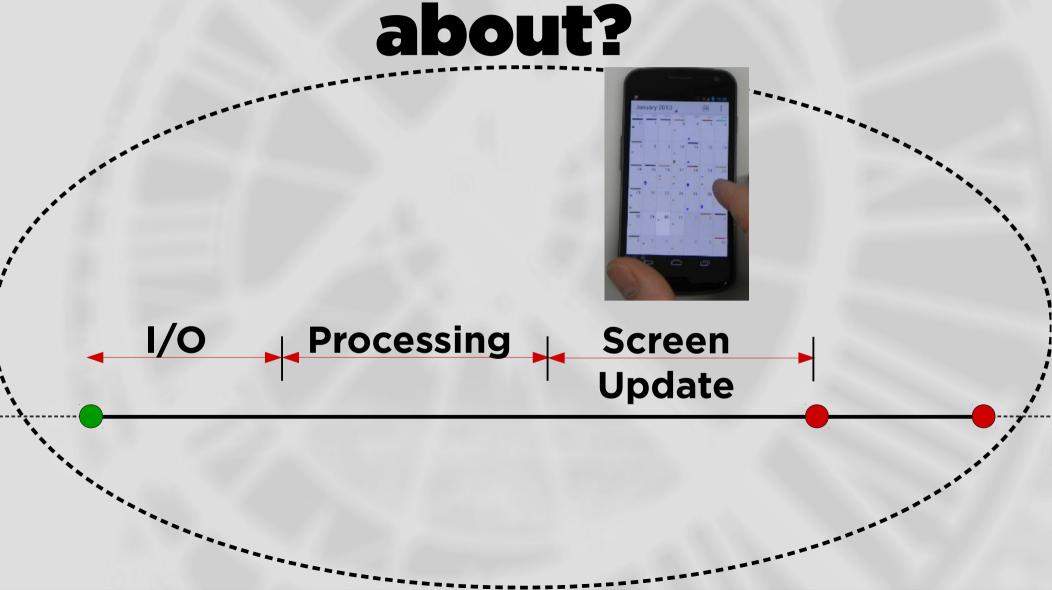
1/0



Processing

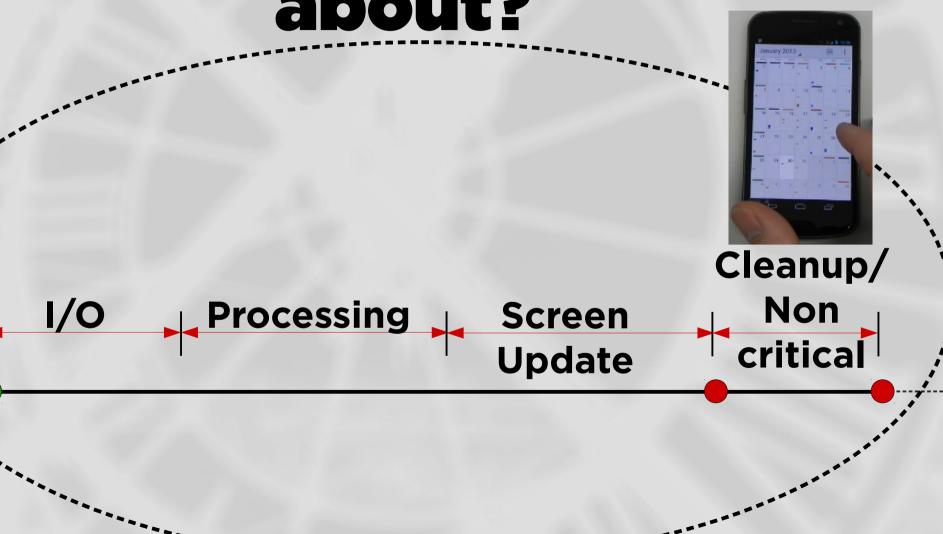








#### What does the user care about?



#### What does the user care about?



System's perception of latency

User's perception of latency



#### What does the user care about?



#### Interaction

Lag

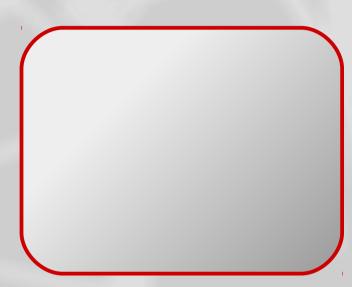


# Quantifying interaction ac,s

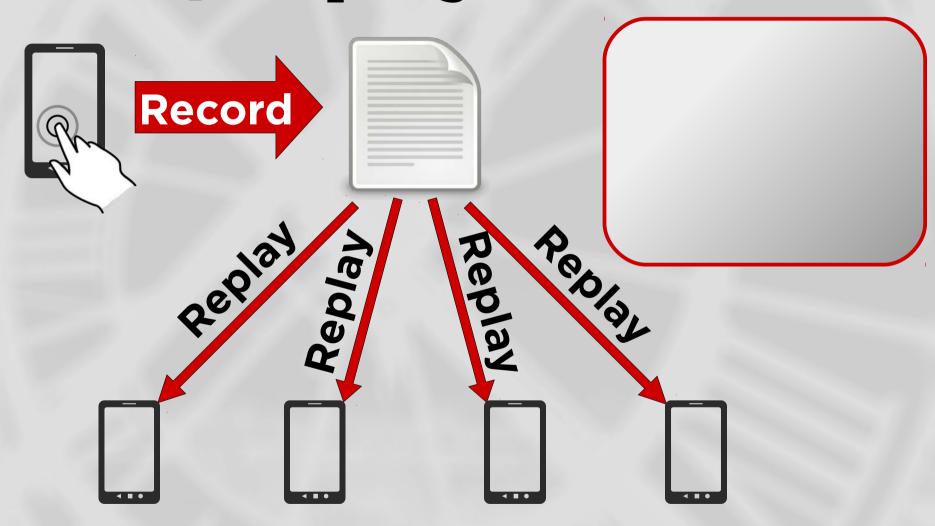


#### Record/Replay

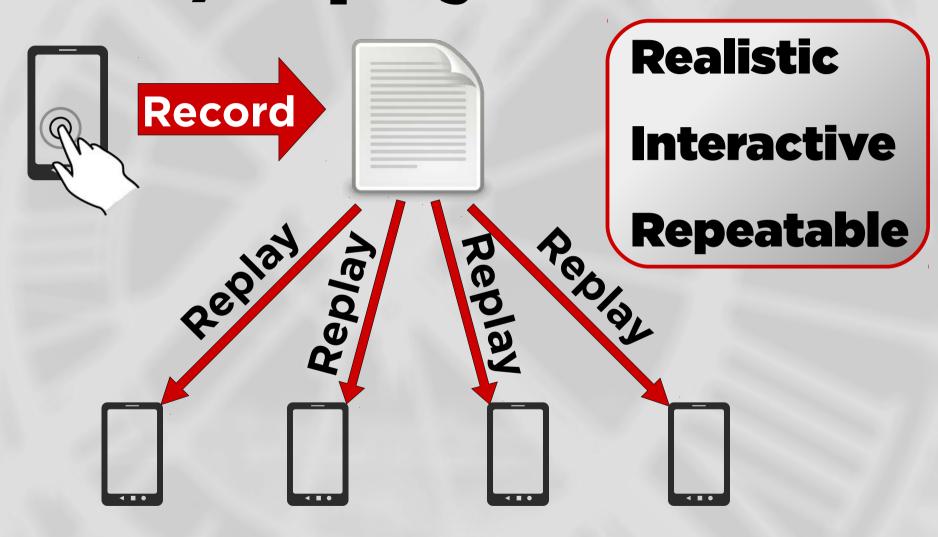




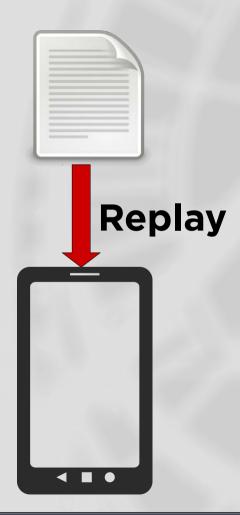


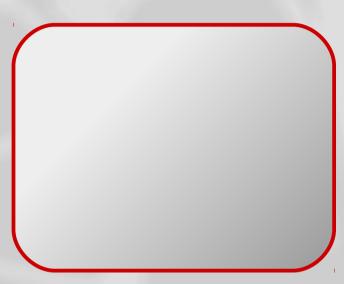


#### Record/Replay



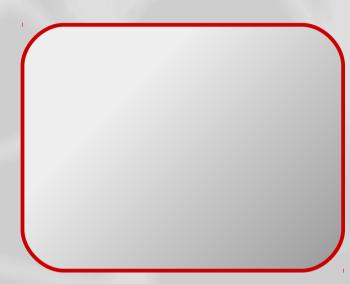




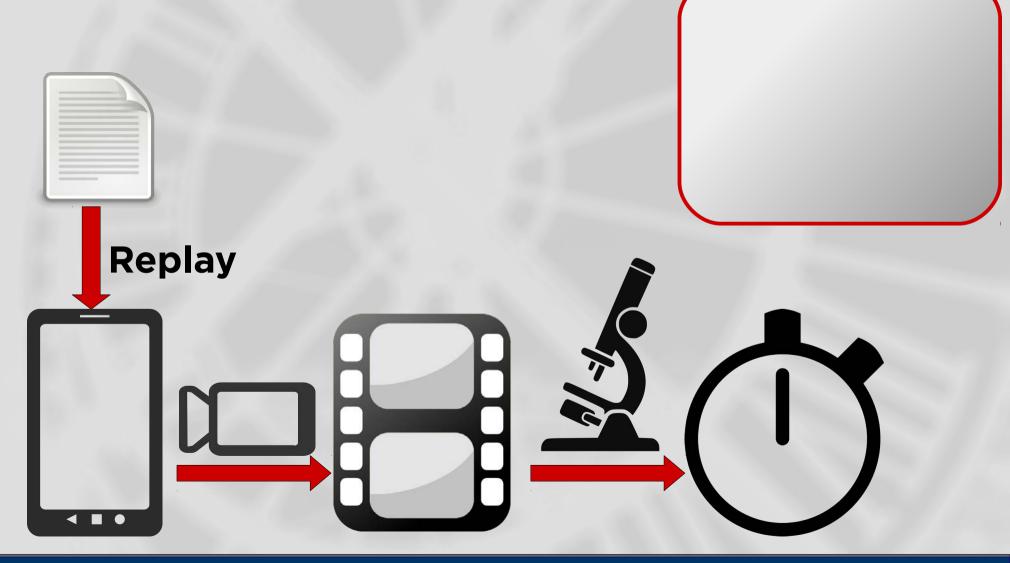




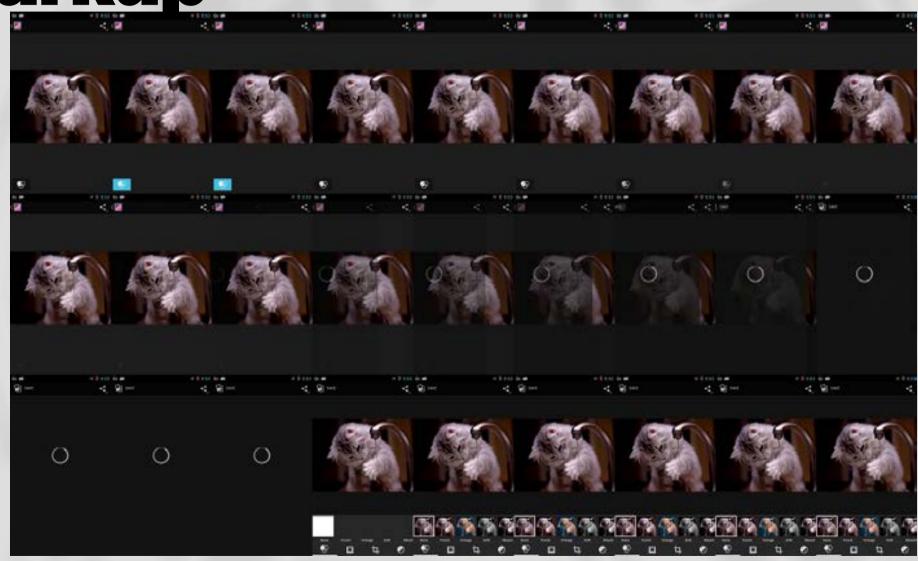




#### Markup

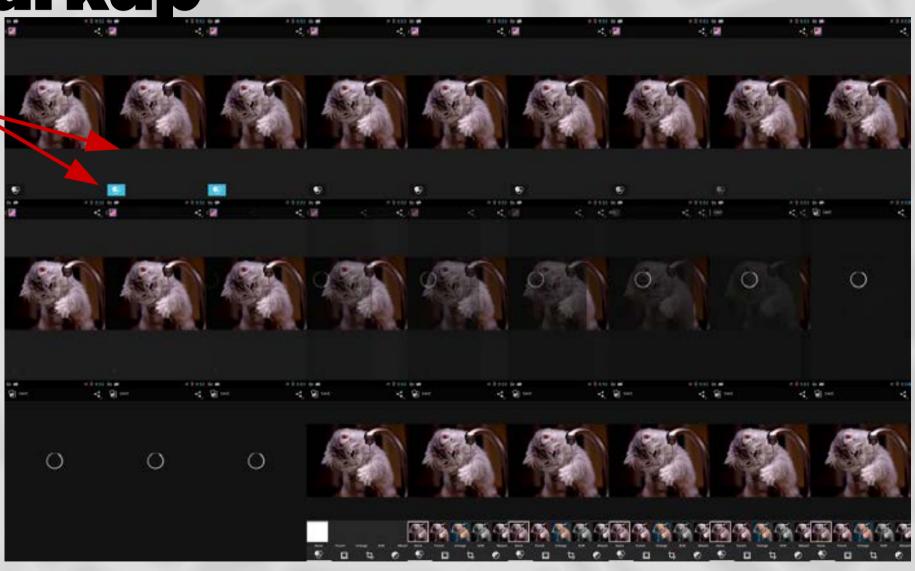








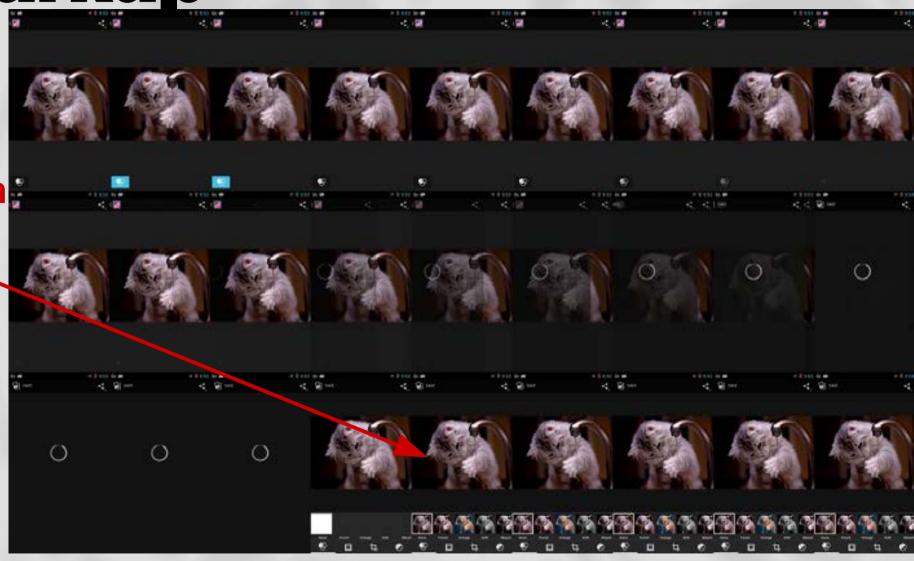


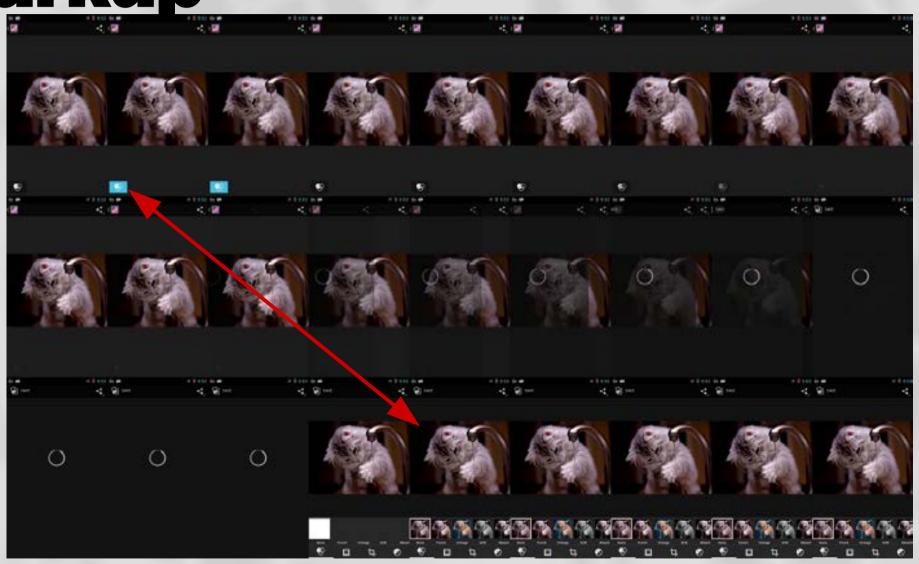




Markup



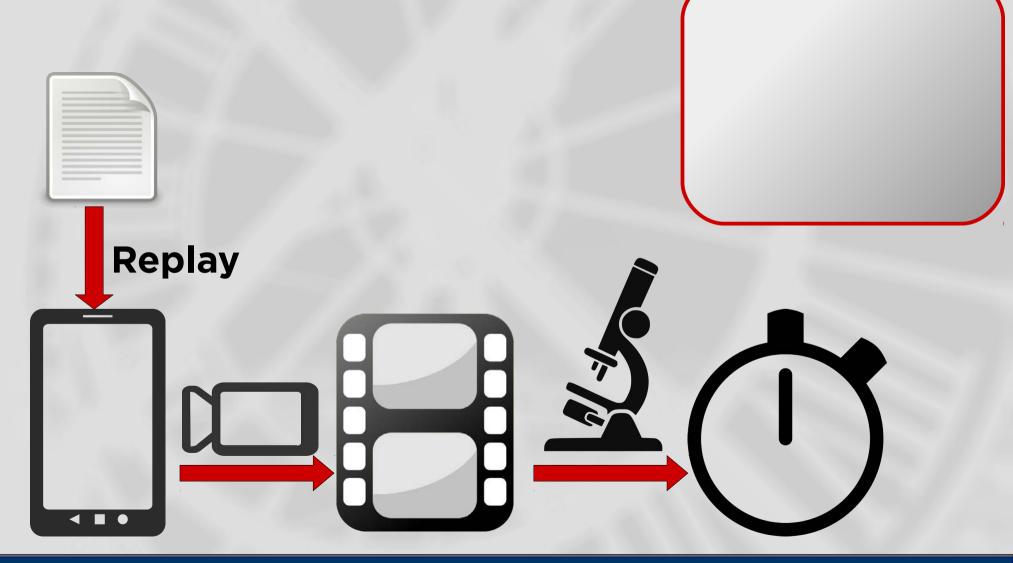




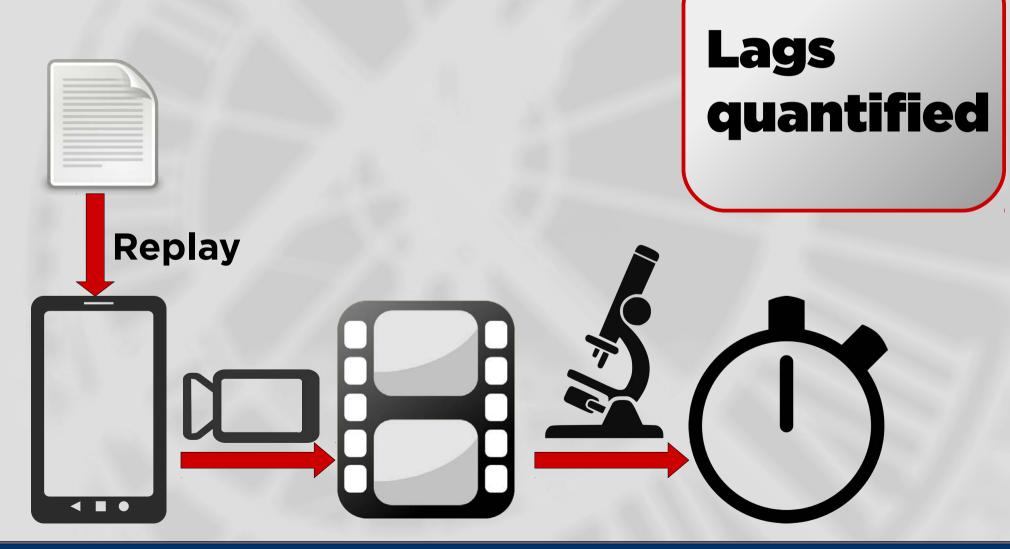




### Markup





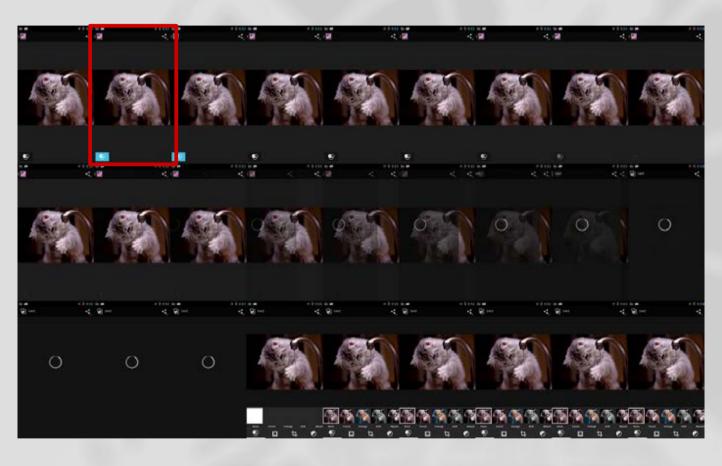




### Markup

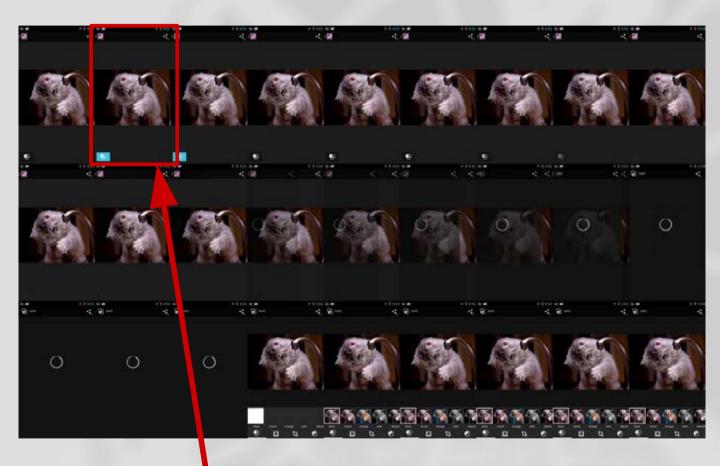






**45** sec per lag



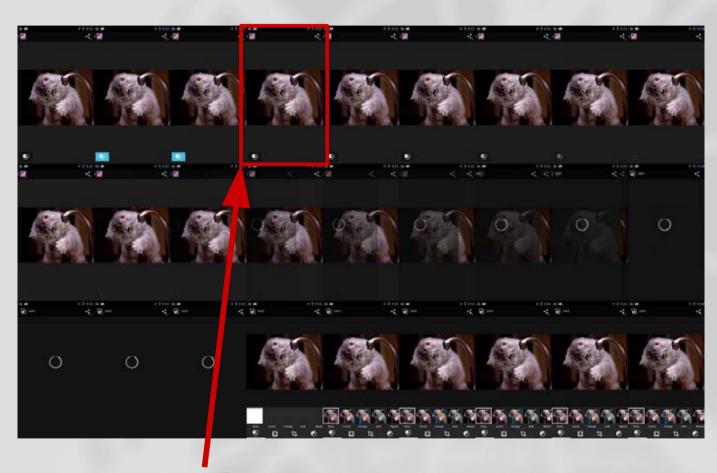


45 sec per lag



Interaction ends after first frame



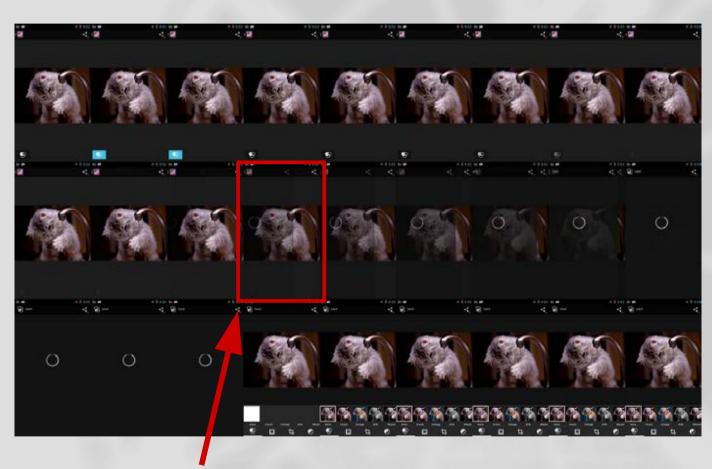


**45** sec per lag



**First Screen** Change



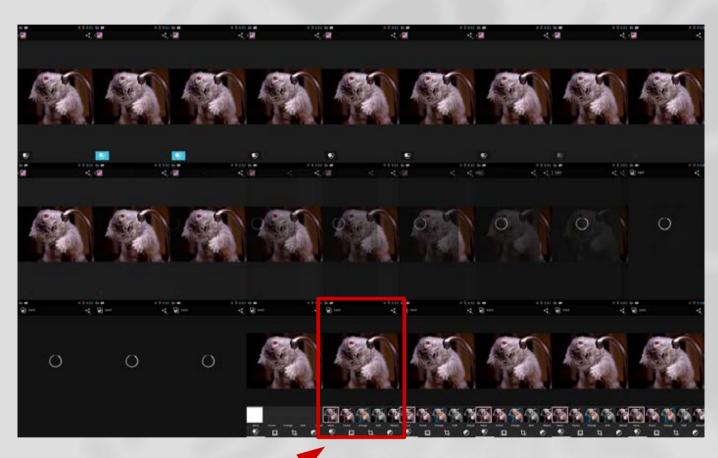


**45** sec per lag



**Screen Changes** after frames of no change



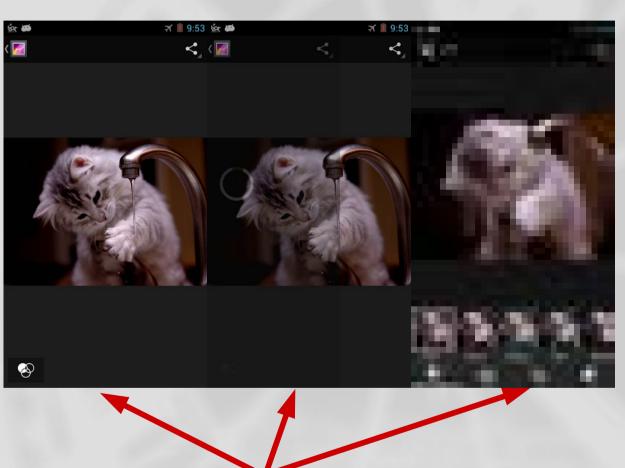


**45** sec per lag



Screen stops changing



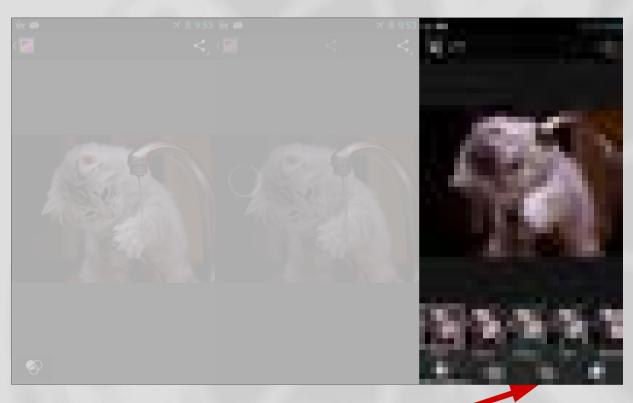


45 sec per lag



3 frames to choose from

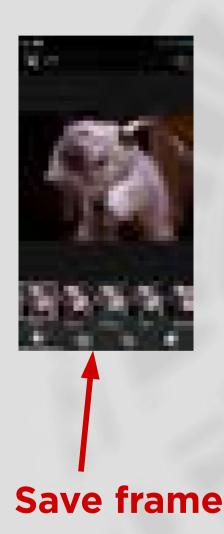




2-5 sec per lag

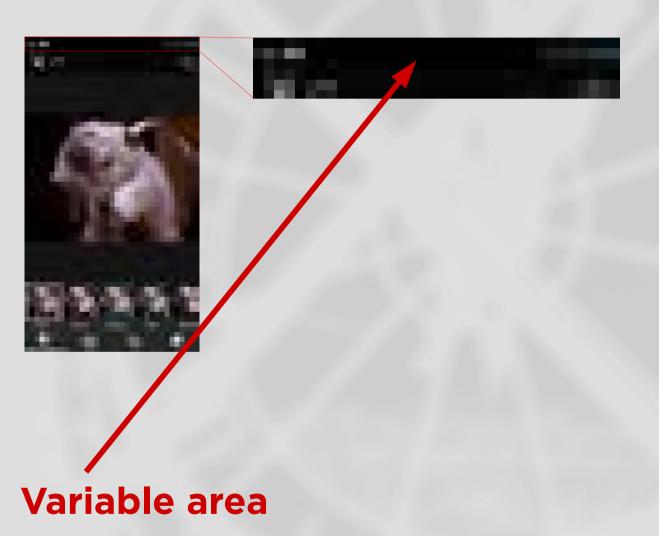
**Interaction End** 





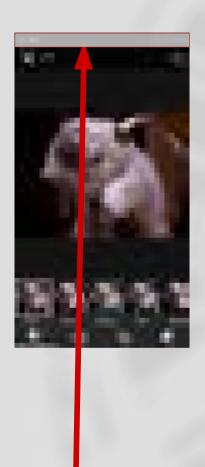
2-5 sec per lag





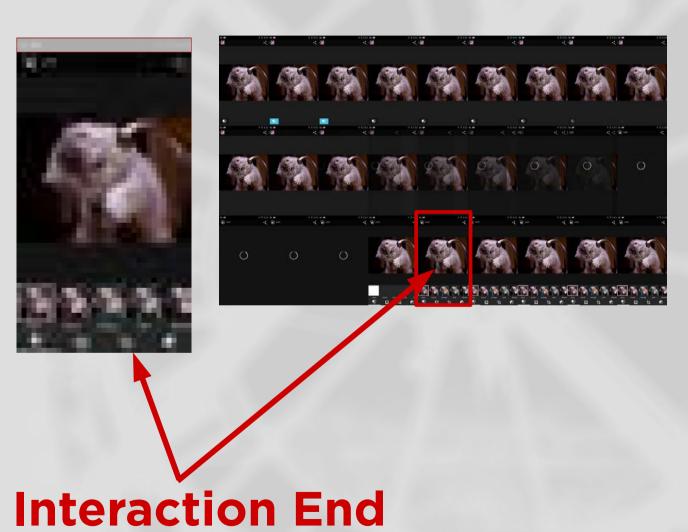
2-5 sec per lag





masked area

2-5 sec per lag



Human input needed only once





# Representative

Real Mobile Applications

Real Inputs

Real Metrics





Same behaviour every time



# Automatic

No code analysis

No instrumentation

No humans needed\*

\*after initial video markup

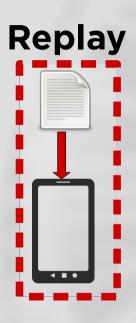
### After the fact

# Lag End Estimation

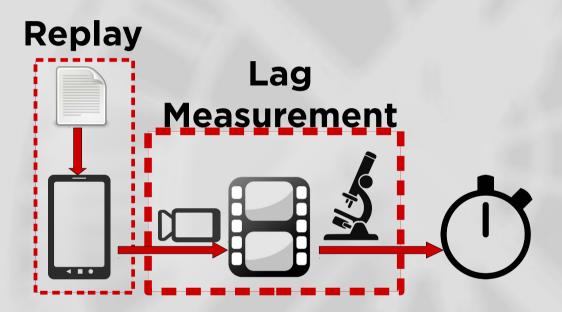




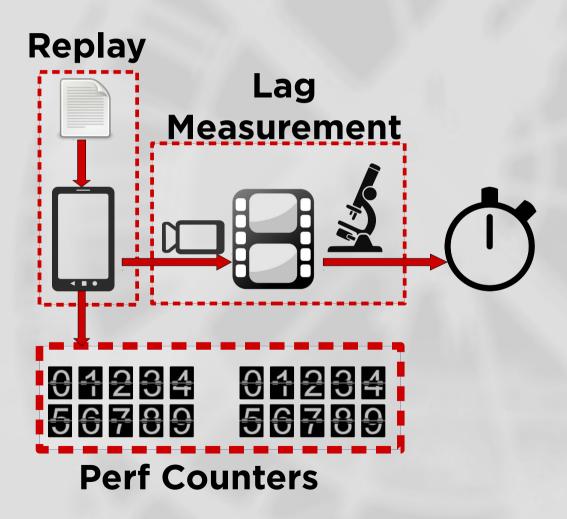




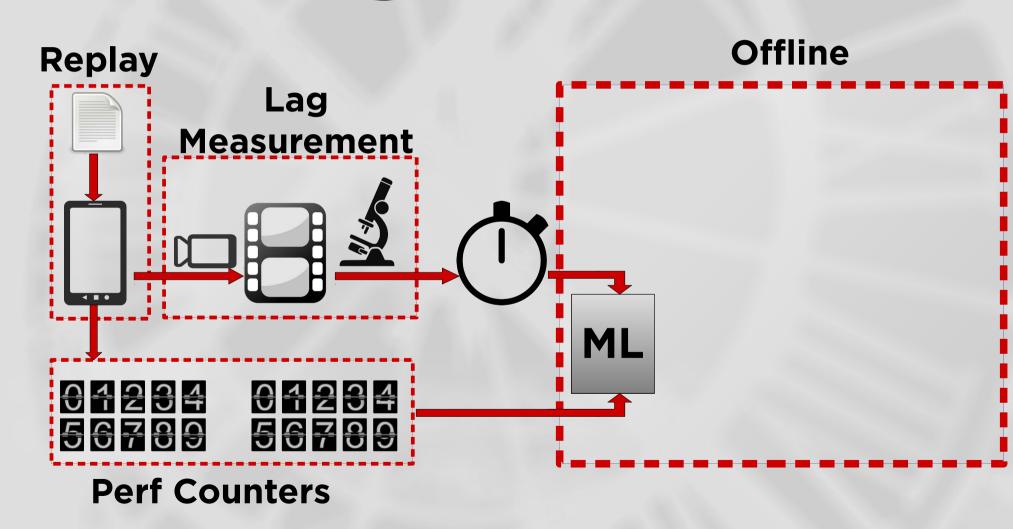






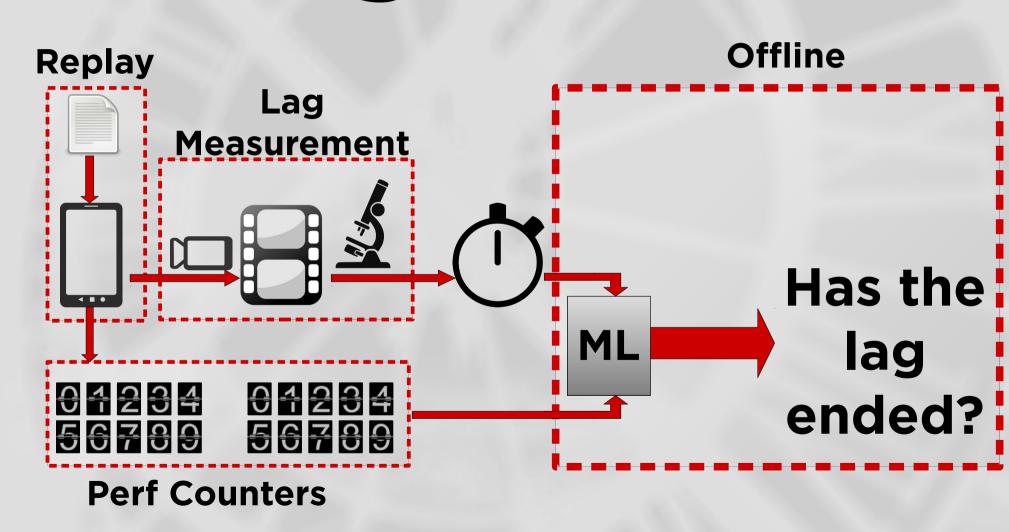


# Training



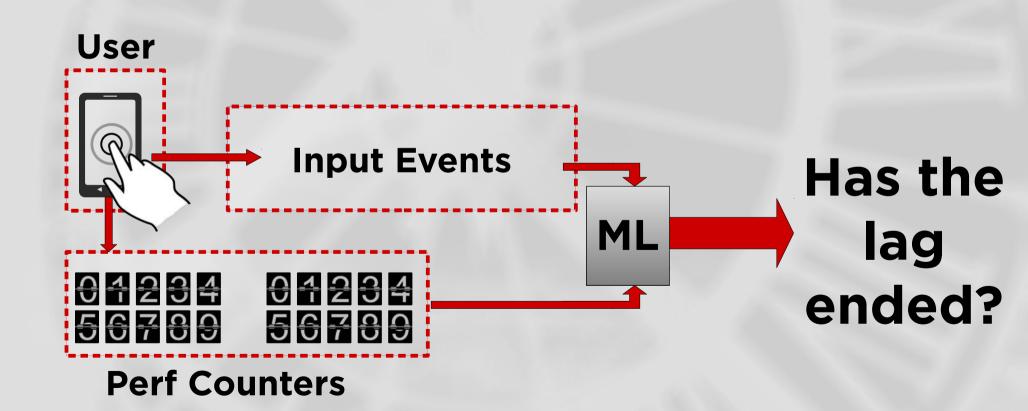


## Training



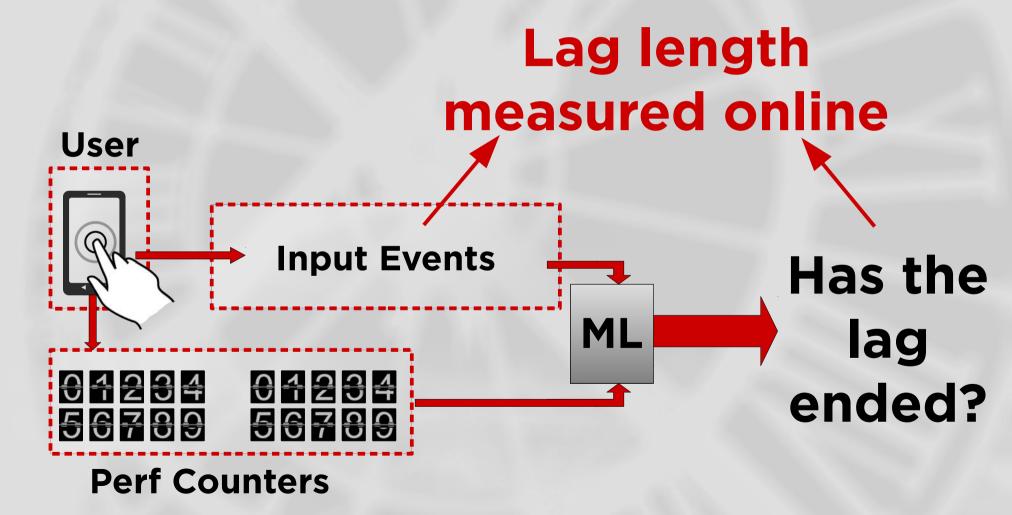


# Online prediction



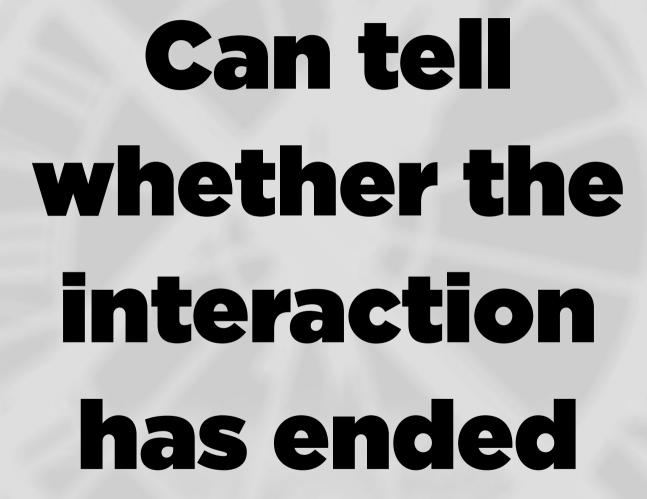


# Online prediction





# Lag End Predictor

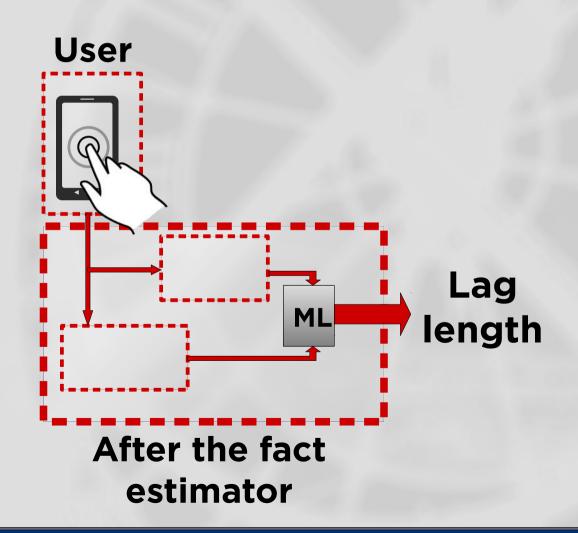






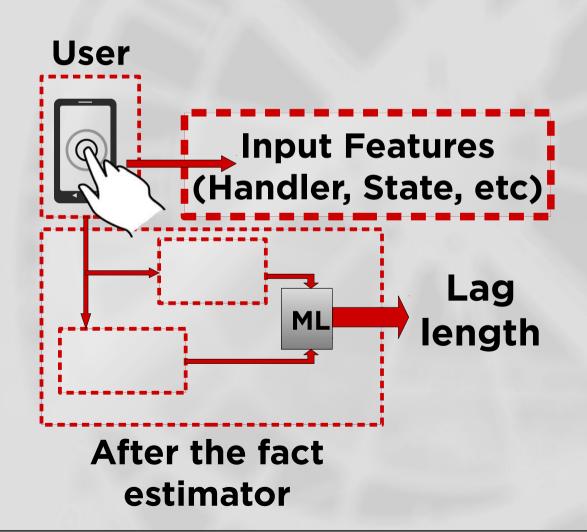


## Lag end prediction



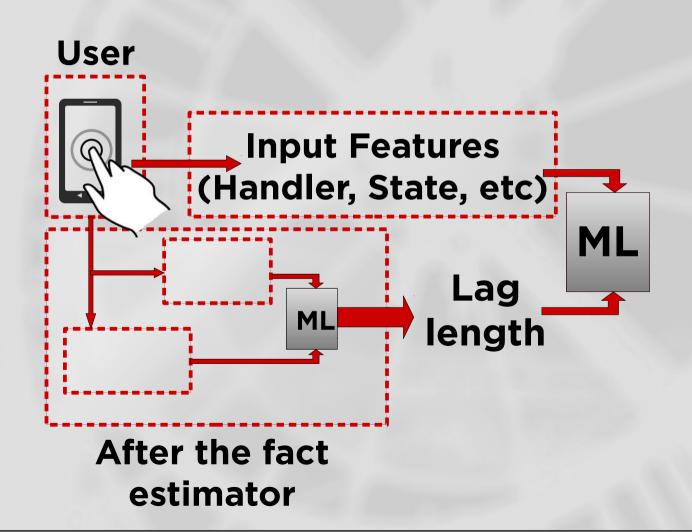


## Lag end prediction

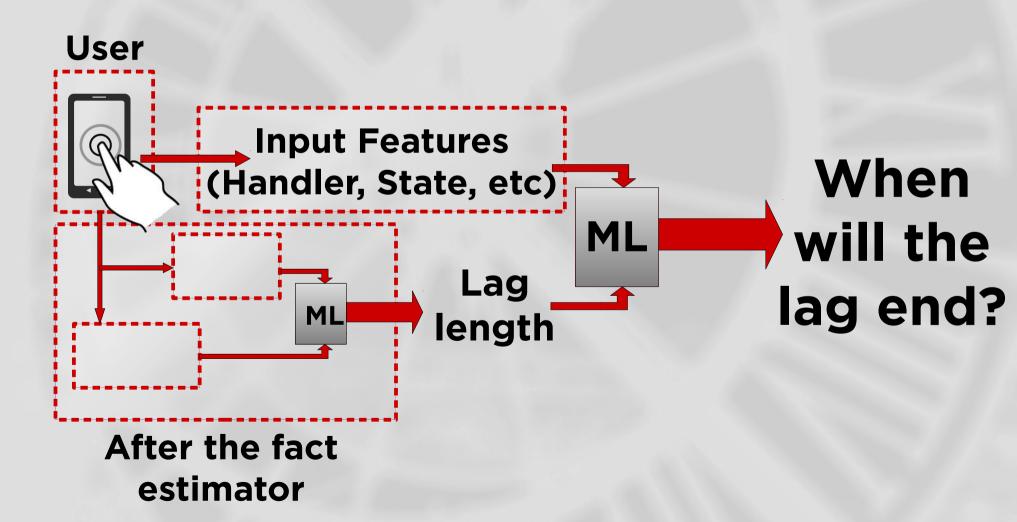




## Lag end prediction



## Lag end prediction



Can test/fine-tune heuristics offline

Can test/fine-tune heuristics offline Will evaluate them online

Can test/fine-tune heuristics offline
Will evaluate them online
Will adapt them online

Can test/fine-tune heuristics offline
Will evaluate them online
Will adapt them online

For what users care about

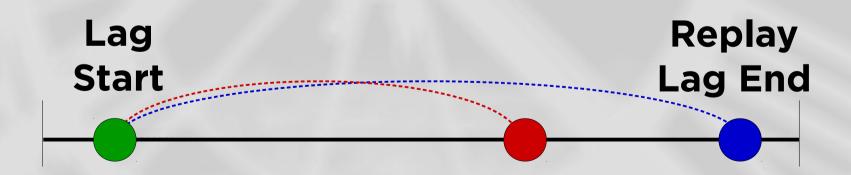
# Anc to c Frequency Governors

#### Android Frequency Governors

## Android Frequency Governors

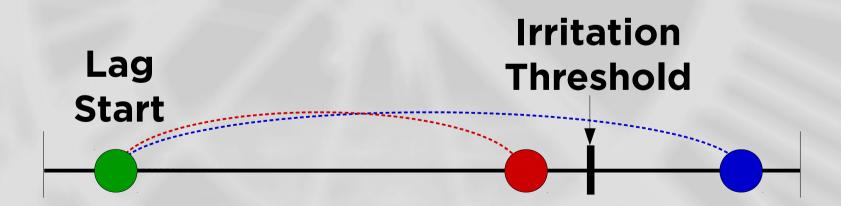




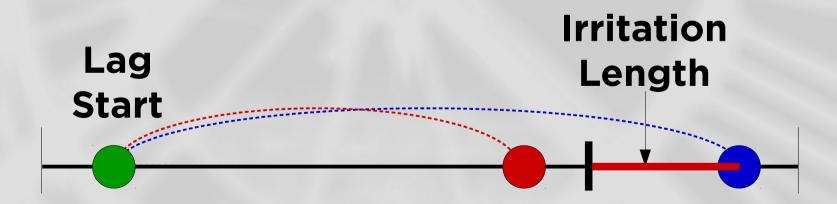




#### Android Frequency Governors

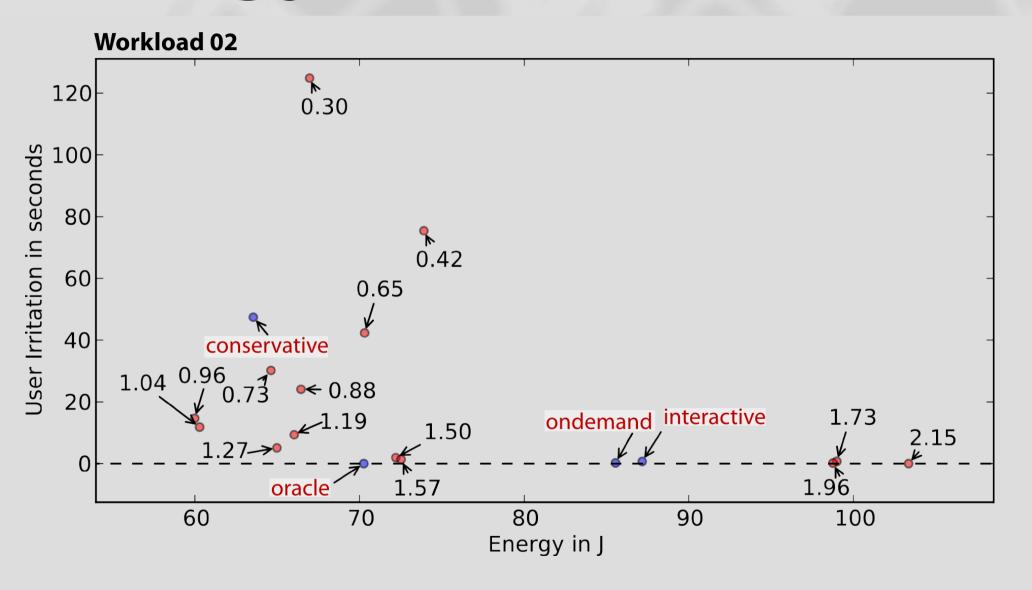




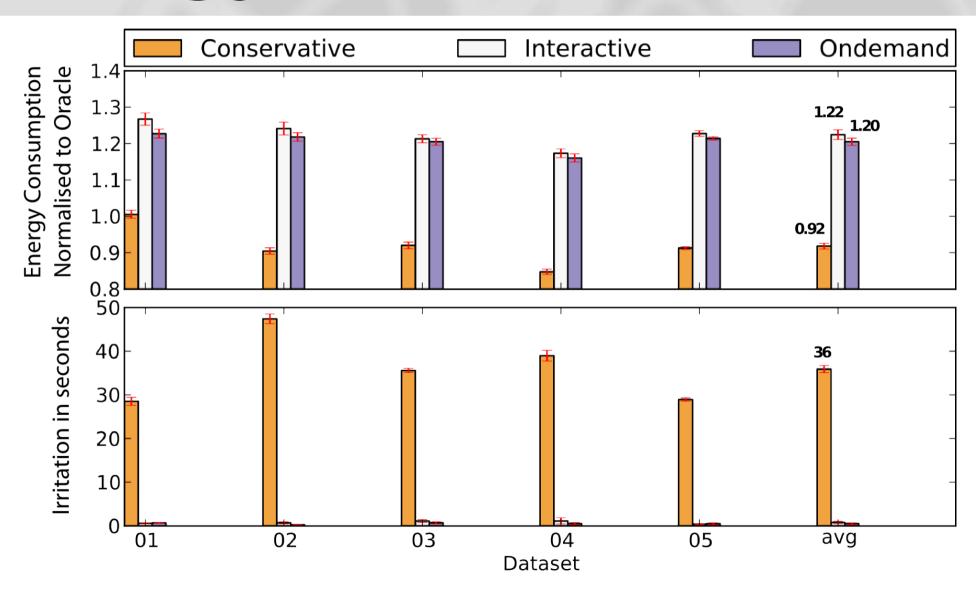




#### **Energy vs QoE**



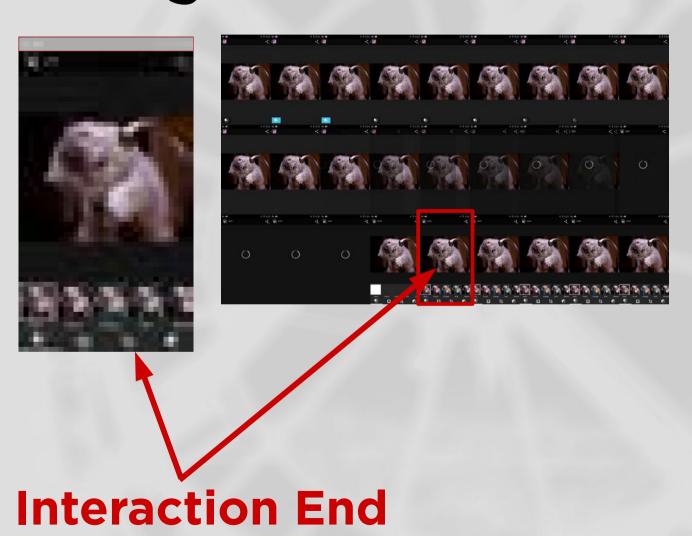
#### **Energy vs QoE**



## Automatic Markup



#### Fully automatic markup

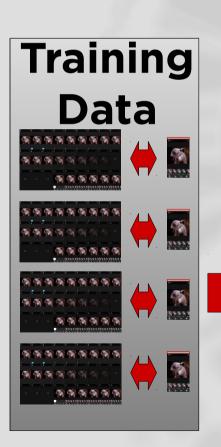


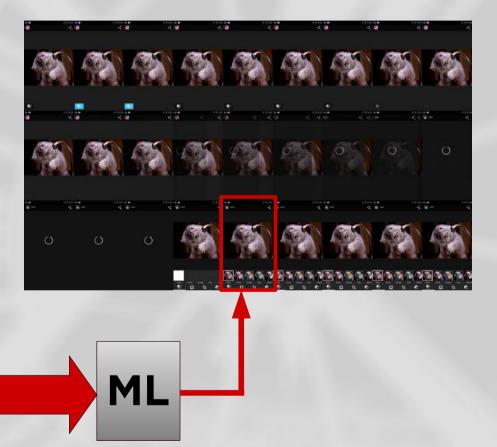
Human input needed only once





#### Fully automatic markup





Human input needed only for training

