

# An Empirical Evaluation of VoIP Playout Buffer Dimensioning for



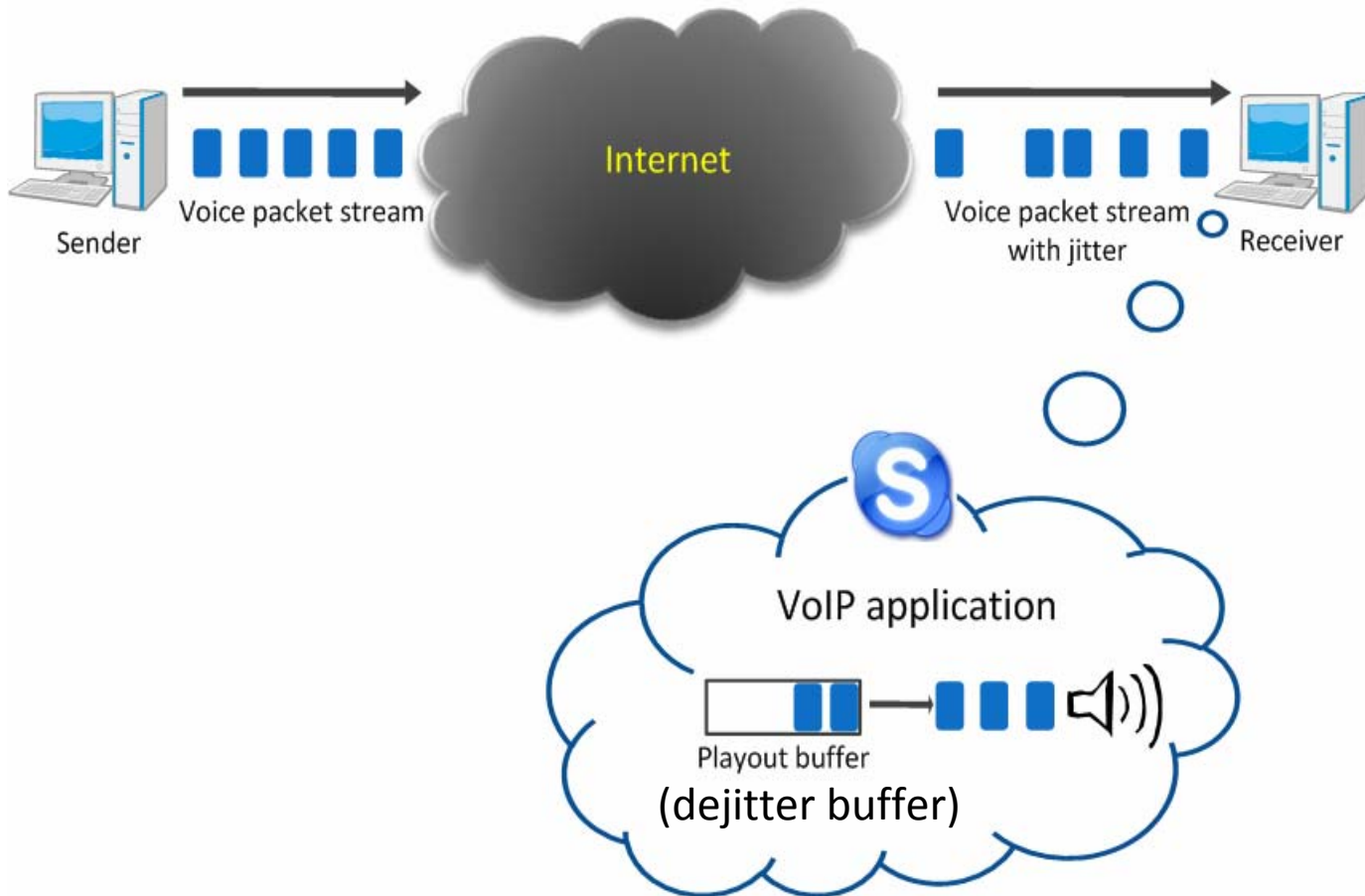
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# Playout Buffering

- Voice needs to be played smoothly, but network may inject delay variance (jitters)



# The Tradeoff

- As buffering sacrifices **delay** in exchange for a higher chance that **voice packets arrive on time**
- Larger buffer size →
  - better speech quality 😊
  - lower conversational interactivity 😞
- Smaller buffer size →
  - worse speech quality 😞
  - higher conversational interactivity 😊

# Playout Buffer Dimensioning

- Deciding the **optimal** buffer size
  - maintain a **balance** between conversational interactivity and speech quality



- It's challenging because of so many factors
    - Network delay
    - Network delay jitter
    - Network loss
    - Codec implementation
    - Redundancy control
    - Error recovery
    - Transport protocol, etc
- } **changes over time**

# Proposals on Buffer Dimensioning

- Many algorithms have been proposed
  - The  $k$  largest delay among the previous  $m$  delays [Naylor'85]
  - Inflate buffer size when packets arrive late, and shrink buffer size over time [Stone'95]
  - Weighted sum of EWMA of delay and delay jitter [Ramjee'94]
  - Automatic adjustment of EWMA weights [Narbutt'03]
  - Weight adjustment within talk bursts [Liang'03, Sreenan'03]
  - ...

# We are curious about ...



Skype: 405 million registrars (15 million online)

Whether a gap exists between  
research community and software  
practitioners?

## In other words ...

Do commercial products really adopt any of these proposals?

What's the performance of commercial products (in terms of buffer dimensioning)?

# Our Contribution

- A systematic measurement **methodology** for measuring VoIP playout buffer size
- Show that the real-life VoIP applications **do not** adjust their buffer sizes appropriately
  - based on QoE measures
- A regression-based algorithm to compute the **optimal buffer size** given a network condition
  - Light-weight computation; thus can be applied in run time



# Talk Progress

- Overview



- Measuring Applications' Buffer Size

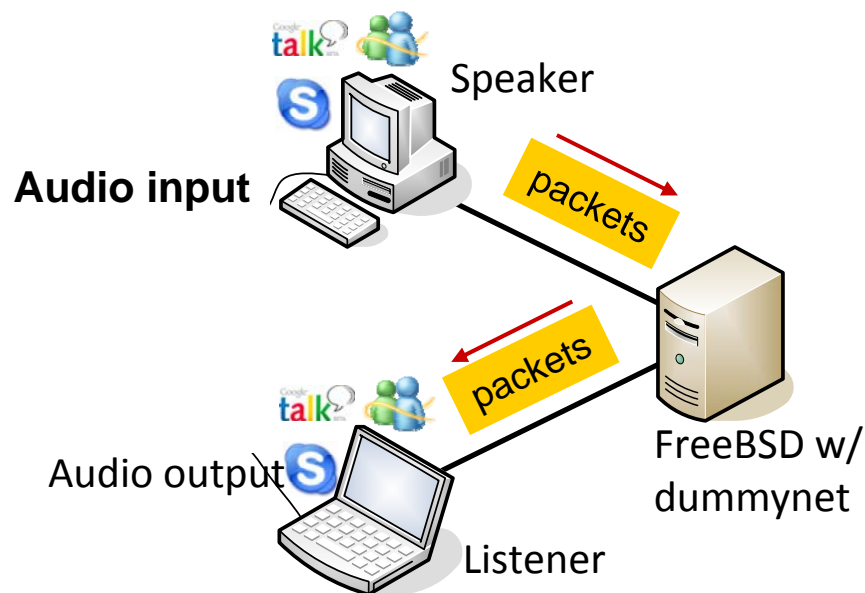
- Experiment Methodology
- Measurement Results

- Deriving Optimal Buffer Size

- Methodology
- Derived Buffer Sizes
- Evaluation of Applications' Dimensioning Algorithms

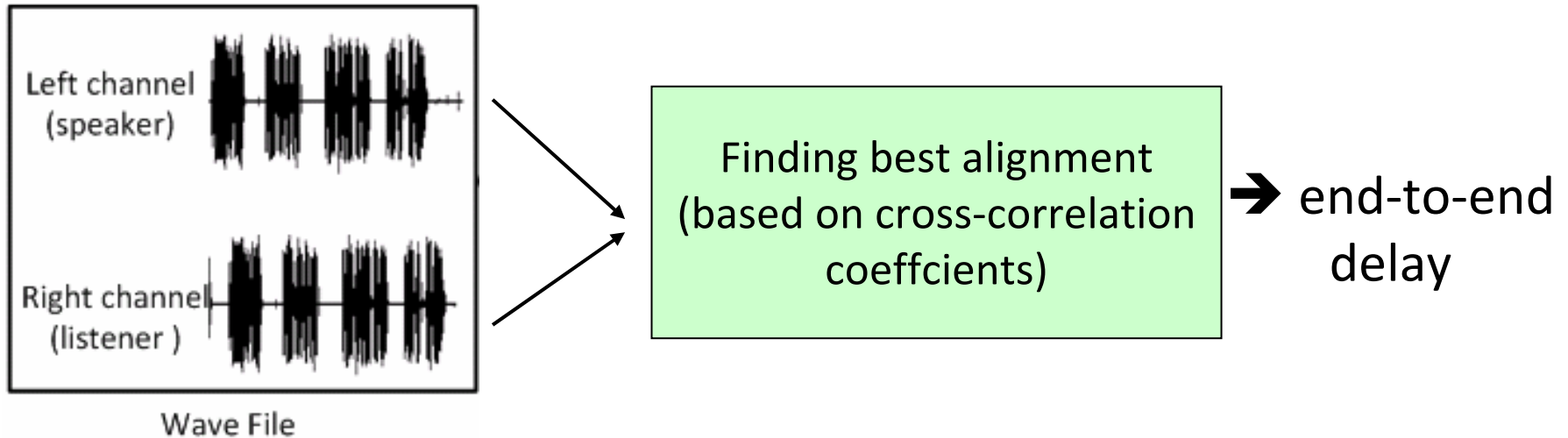
- Conclusion & On-going Work

# Experiment Methodology



- Dummysnet for controlling network conditions (delay, jitter, and packet loss)
- Use a recording card (ESI Maya44) to ensure time-synchronized audio recordings from two hosts

# Buffer Size Estimation



## ■ End-to-end delay components

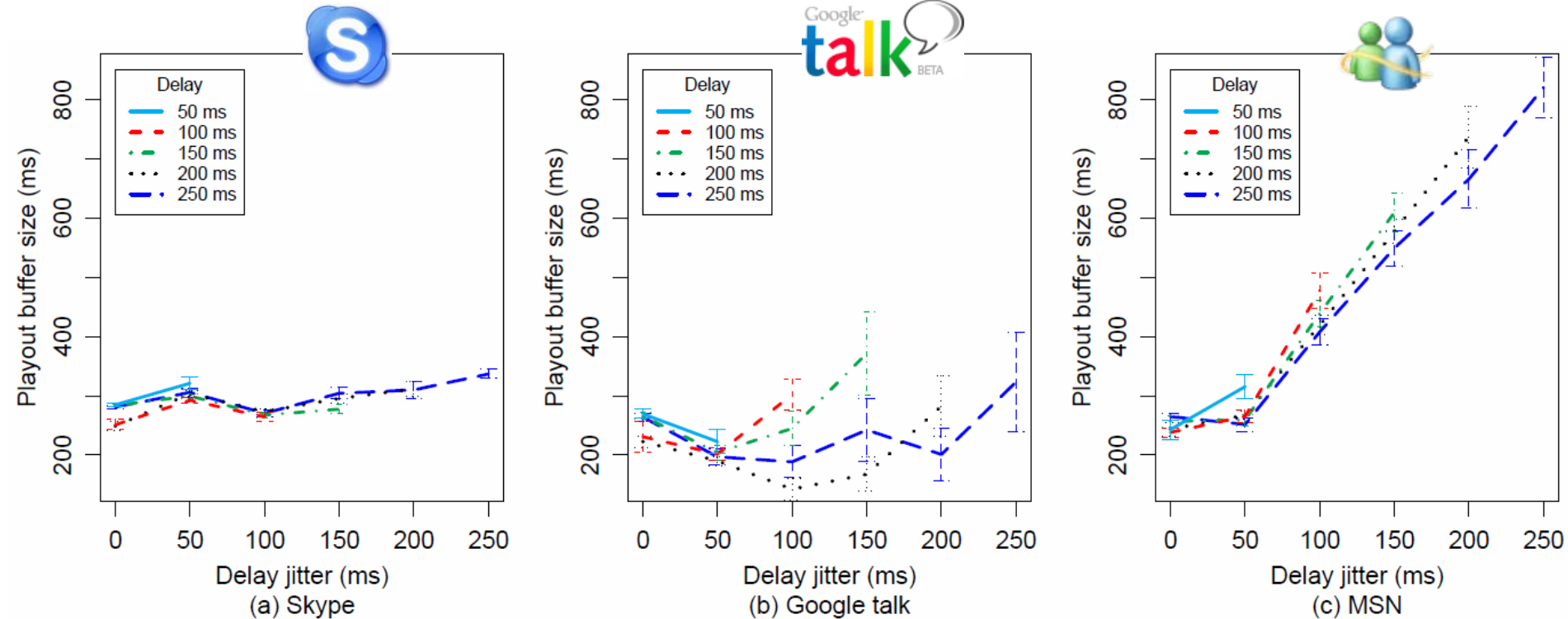
- Network delay (dummysnet)
- Coder delay + packetization delay (assumes 50 ms)
- Playout buffering delay (unknown)

■ Buffer size = e2e delay – network delay – 50 ms

# Experiment Settings

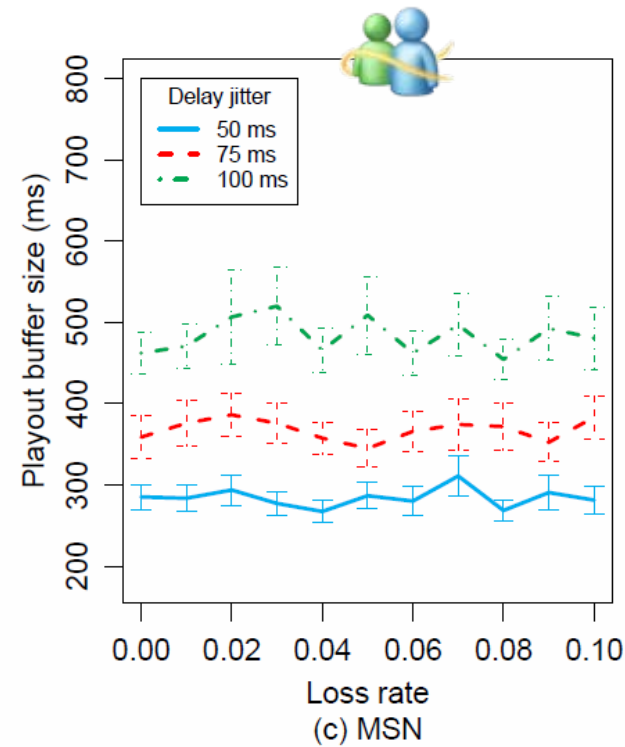
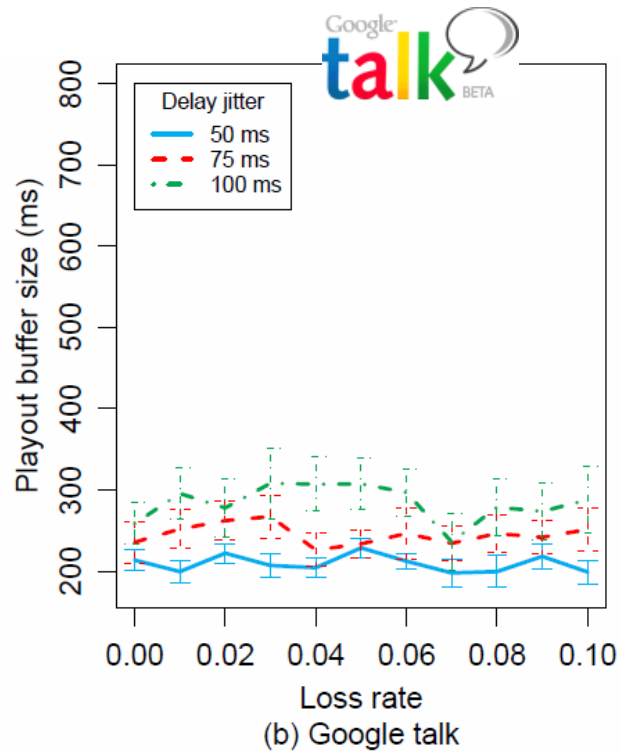
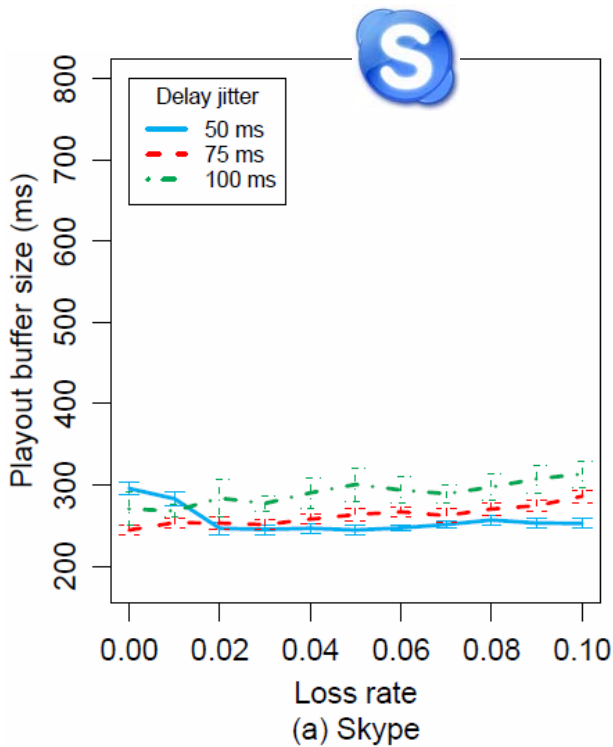
- Application: Skype, Google Talk, MSN Messenger
- Network delay & jitter: 0 ms, 25 ms, 50ms, ..., 200 ms
- Network loss rate: 0%, 1%, ..., 10%
- 10 VoIP calls for each app/network setting
  - Each call lasts 240 seconds

# Effect of Delay and Jitter



- Skype maintains the same buffer size
- Google Talk slightly adjusts the buffer size according to delay and jitter
- MSN Messenger's buffer size grows linearly as the jitter increases

# Effect of Packet Loss




- All three applications do not adapt buffer size to packet loss

**Having seen the different behavior  
of the applications, ...**

Which one application's playout  
dimensioning is best?

Is the best one optimal?

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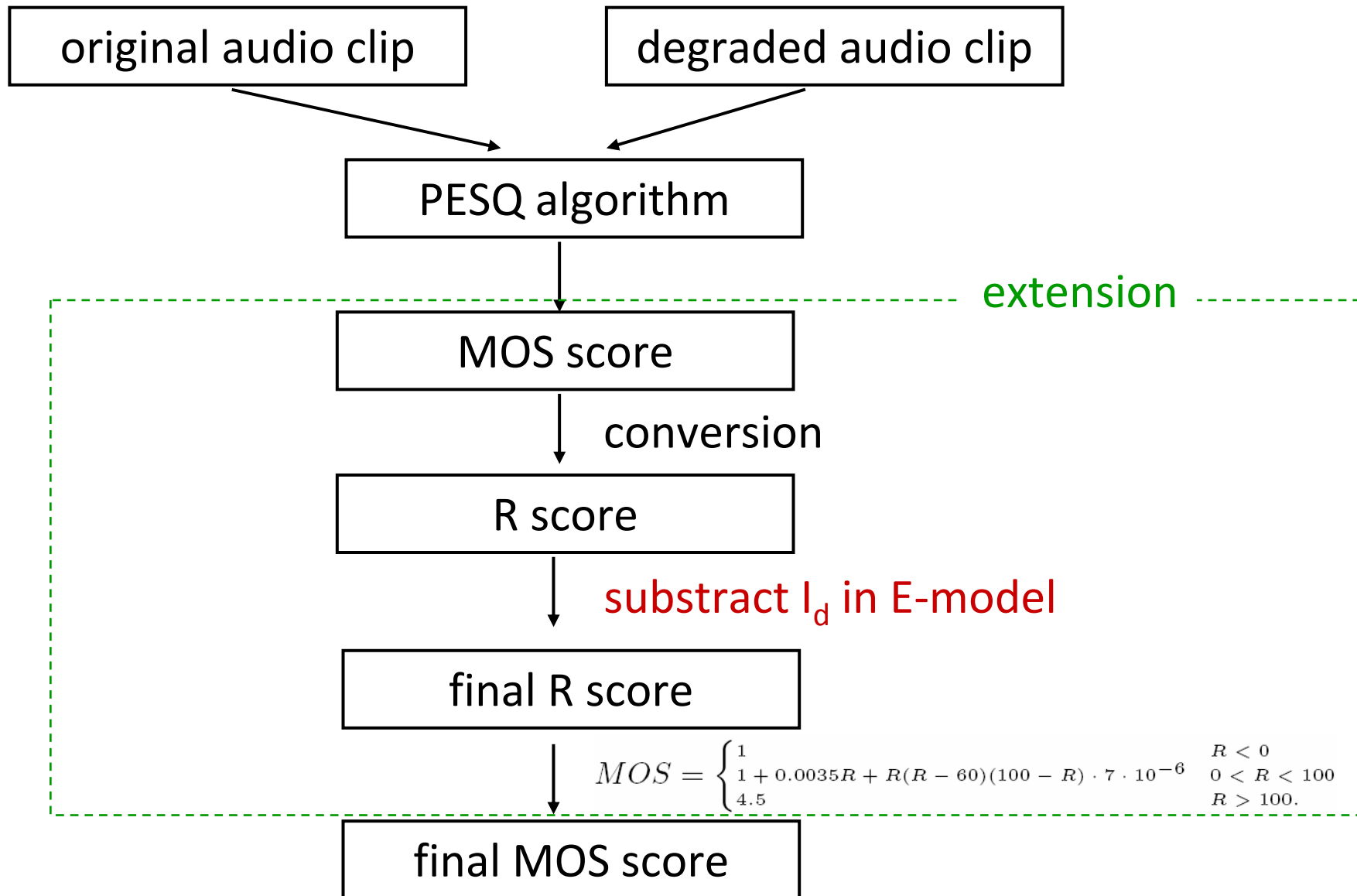
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# Deriving Optimal Buffer Size - QoE

- How to define the “optimal” buffer size?
  - Buffer size that yields the best quality of experience (QoE)
- How to measure the QoE of a VoIP call?
  - PESQ (ITU-T P.862, Perceptual Evaluation of Speech Quality)
    - measures **listening quality**
    - signal level, accurate
  - E-Model (ITU-T G.107)
    - measures **overall quality** (listening + interactivity)
    - network level, lightweight but not accurate in listening quality

# QoE Assessment Model [Ding'03]

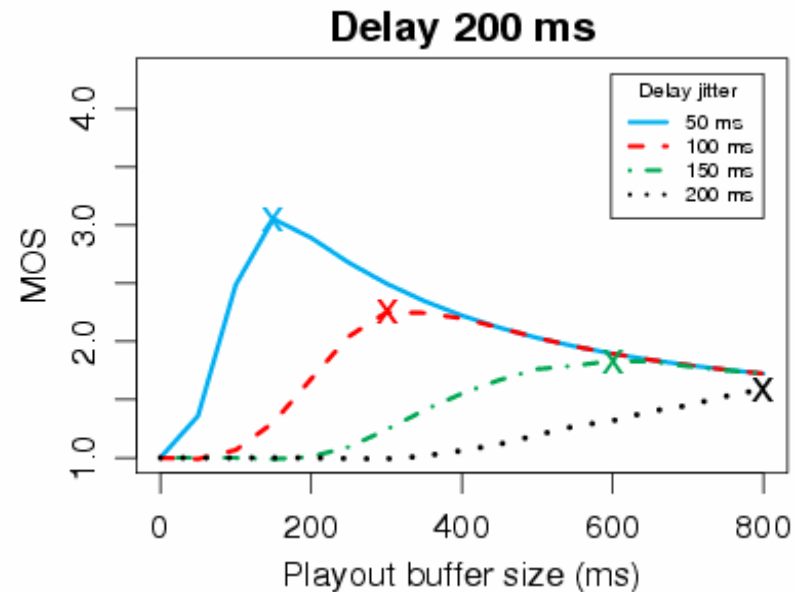
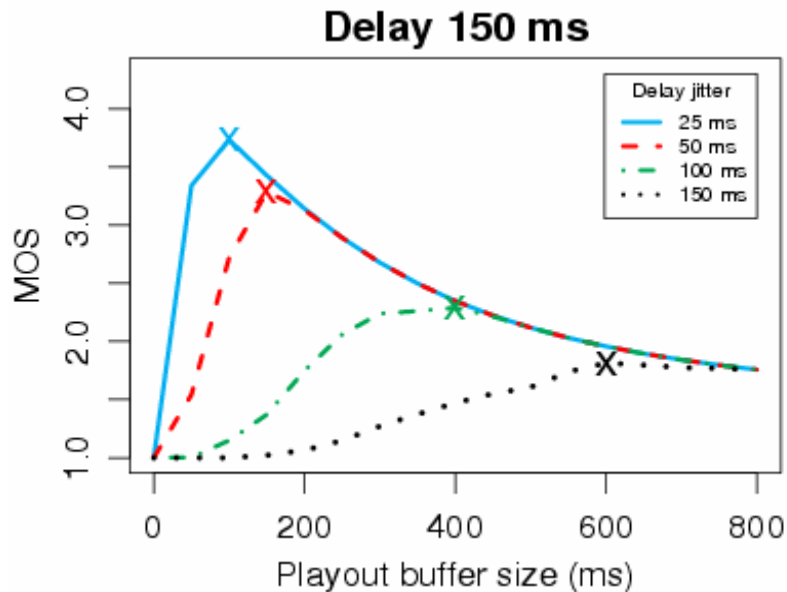
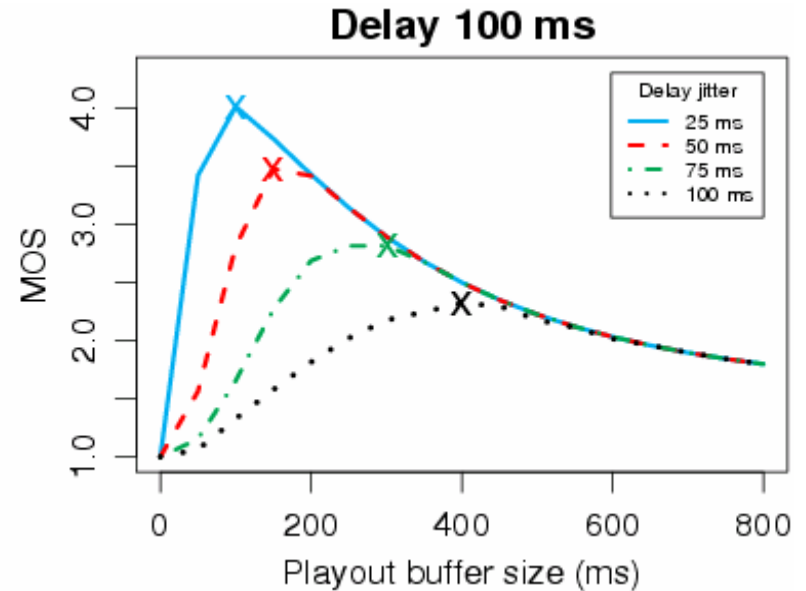
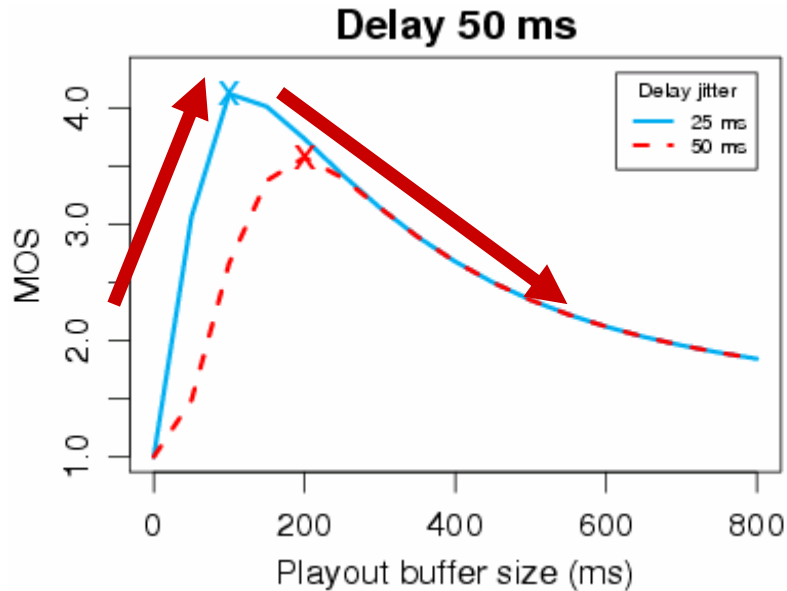


# Deriving Optimal Buffer Size - Simulation

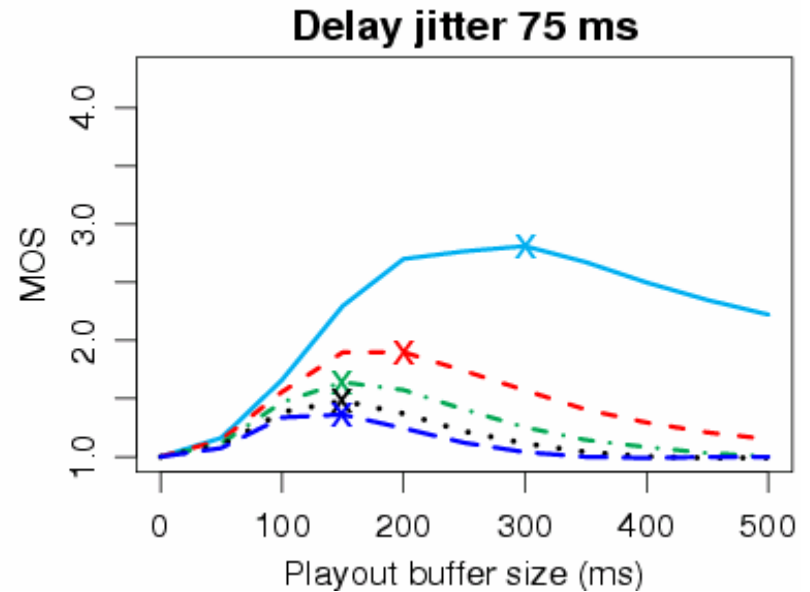
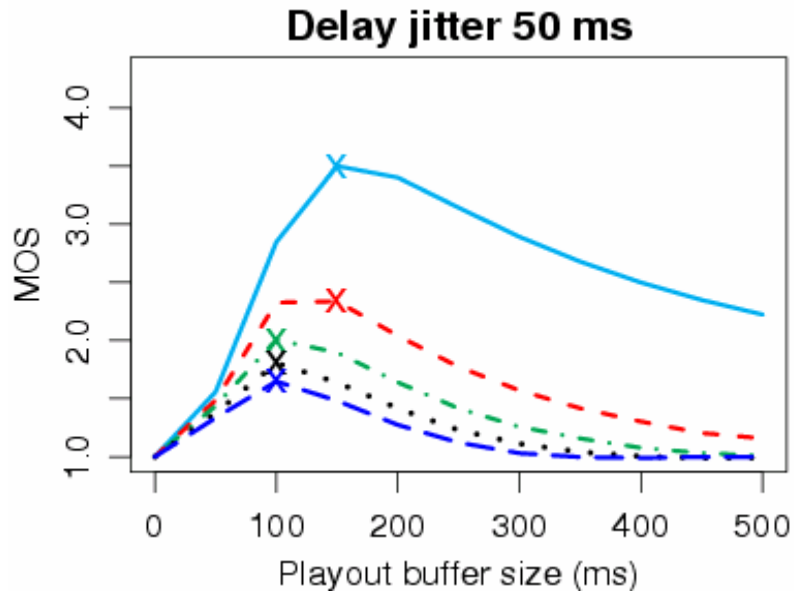
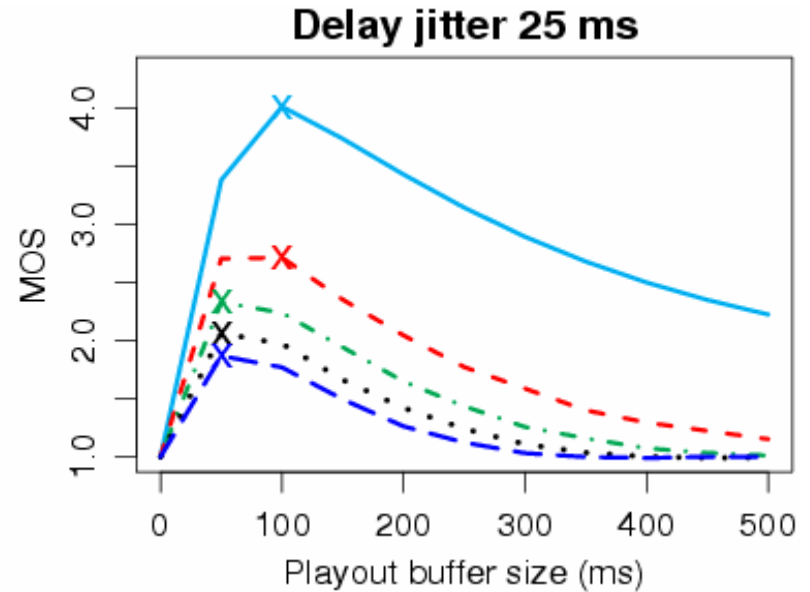
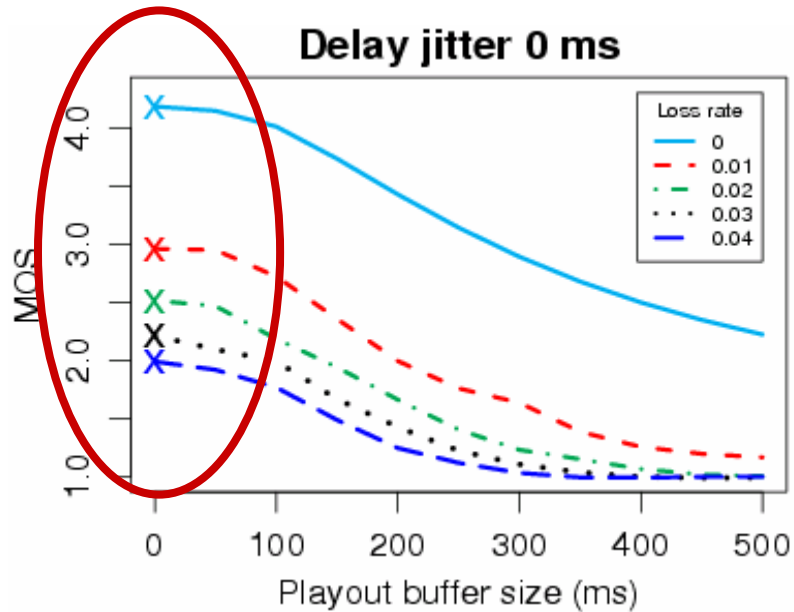
For each (buffer size, network setting)

1. Encode an audio clip into a sequence of VoIP frames
2. Impairment at the network
  - network delay & jitter
  - packet loss (Gilbert model)
3. Packet discarding at the receiver
  - drop a packet if its arrival time is later than scheduled time (sent time + playout buffer size)
4. Decode the result frames (a subset of original frames) to a **degraded** audio clip
5. Compute average QoE scores

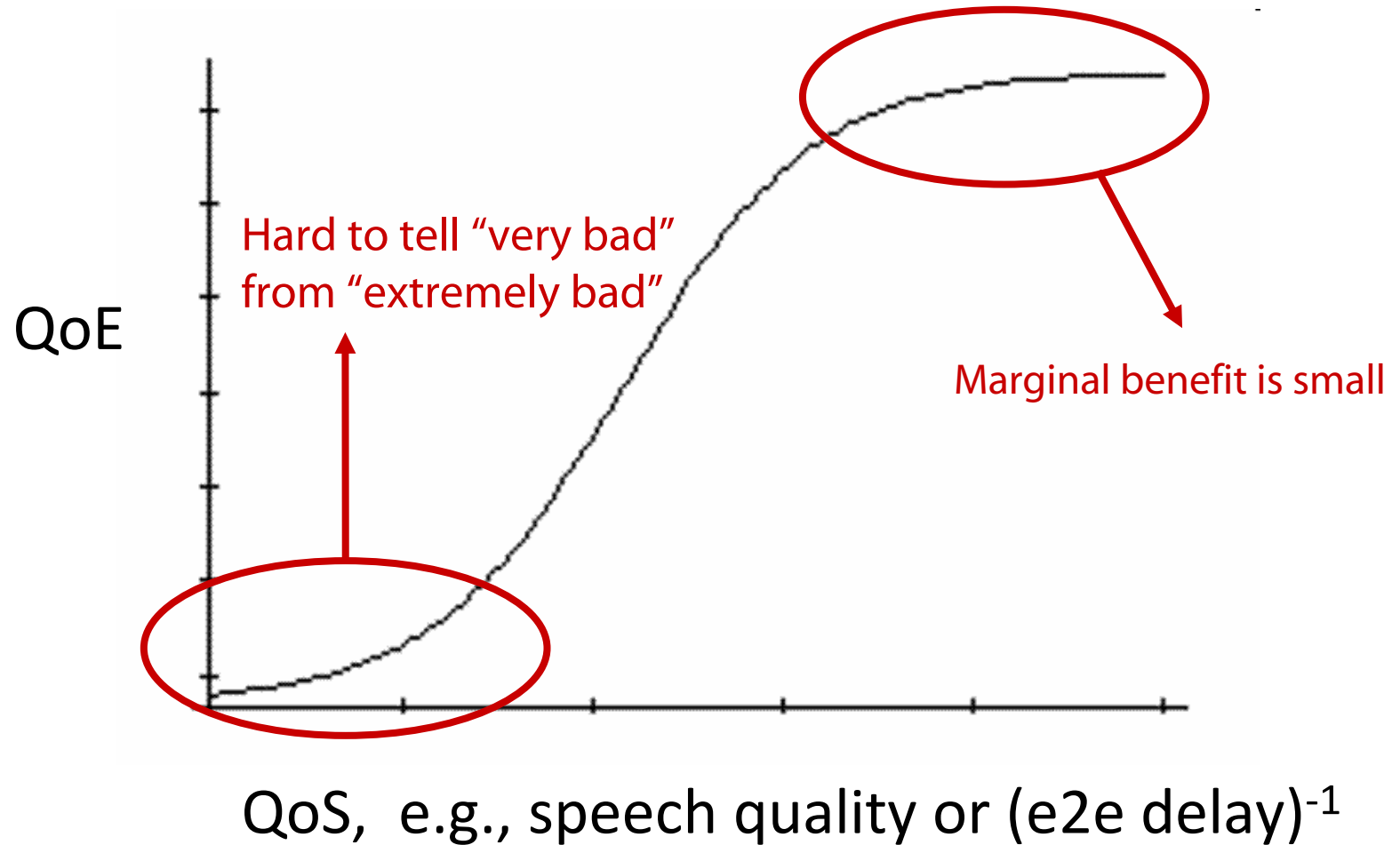
# Derived Optimal Buffer Size (1)



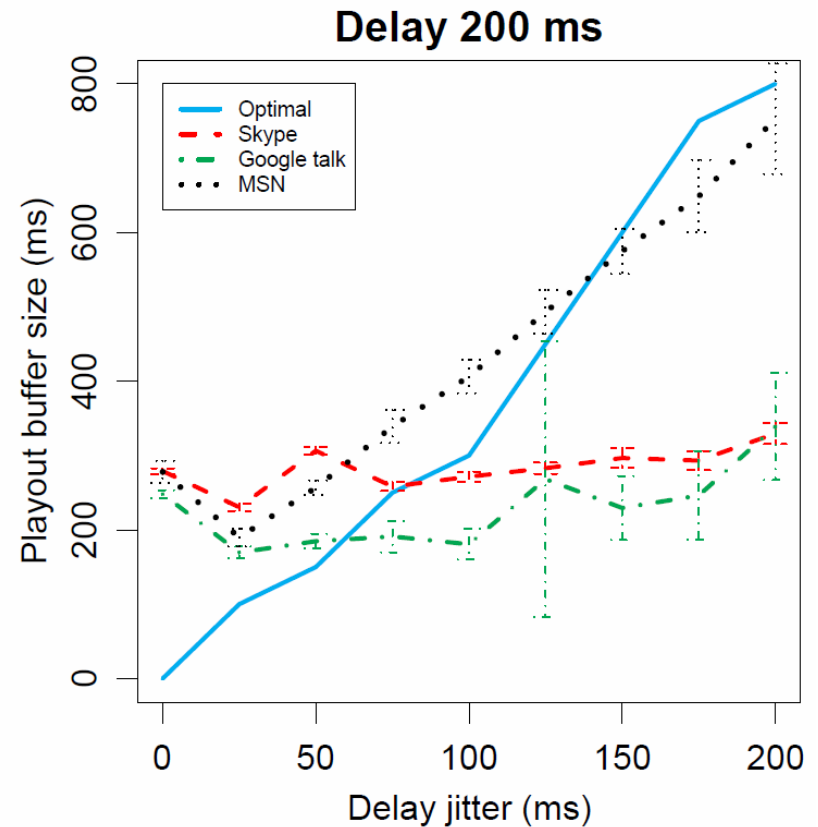
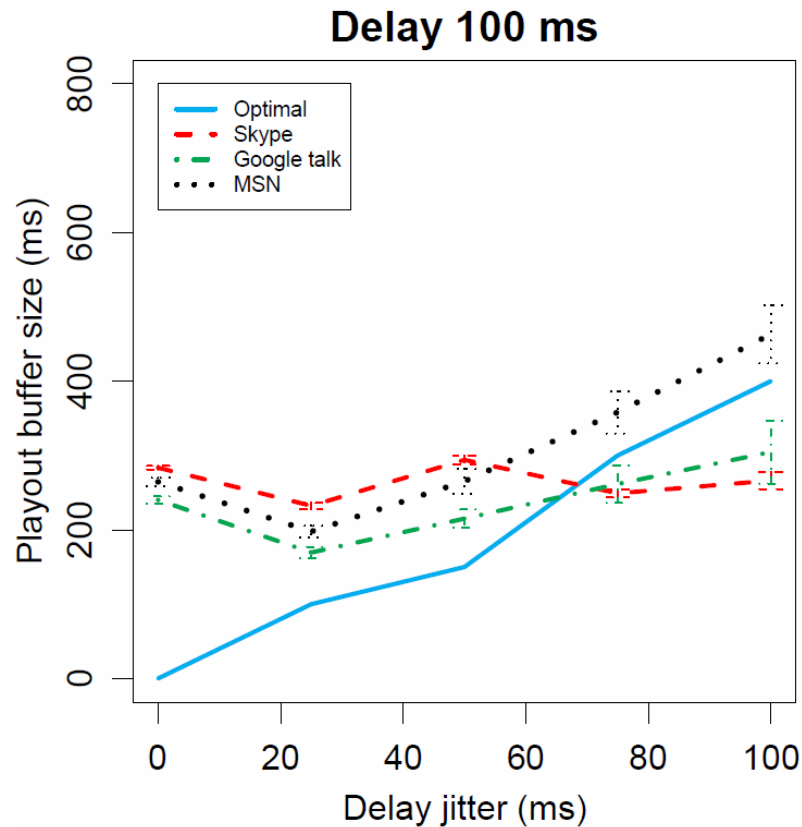
# Derived Optimal Buffer Size (2)



# A typical relationship between QoS and QoE



# Comparing Real-Life Applications with Optimal Settings



- MSN Messenger's buffer dimensioning algorithm is better than those of Skype and Google Talk

# Modeling Optimal Buffer Size

- Using a linear regression to model the optimal buffer size given a network setting

$$\begin{aligned} & (const.) + coef_{delay} \cdot delay + \\ & coef_{delay \cdot jitter} \cdot delay \cdot jitter + \\ & coef_{delay \cdot jitter \cdot plr} \cdot delay \cdot jitter \cdot plr \end{aligned}$$

Variable	Coef	Std. Err.	t	Pr >  t
(constant)	157	20	7.54	$< 2 \times 10^{-9}$
delay	-1.05	0.21	-4.78	$< 2 \times 10^{-5}$
delay · jitter	0.02	< 0.01	17.25	$< 2 \times 10^{-16}$
delay · jitter · plr	-0.57	0.04	-11.65	$< 5 \times 10^{-15}$



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# Conclusion

- Our results show that MSN Messenger performs the best in terms of buffer dimensioning
  - Proprietary codec are used in Skype
  - Other factors may dominate the final quality perceived by users
- Results from the research community seem not be applied in real-life VoIP applications
  - methods not generalizable enough?
  - methods not intuitive enough?
  - methods not practical enough? (e.g., hard to implement)
  - other explanations?
- A regression modeling approach to compute the optimal buffer size in run time

# On-going Work

- More factors in measuring applications' buffer dimensioning behavior
  - frame size, redundancy control, loss burstiness, speech codec, ...
- More factors in deriving optimal buffer size
  - transport protocol (TCP in addition to UDP), speech codec, ...
- Real-life network experiments to evaluate the regression-based buffer dimensioning algorithm

# Thank You!

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