

# Towards Detecting Differential QoE

**David Choffnes, Northeastern**  
**(joint work with SBU)**

Supported by a Google Grant



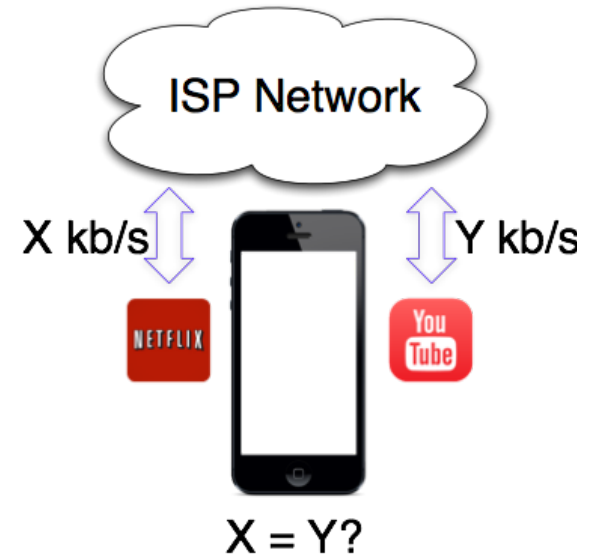
# Traffic differentiation

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## Traffic differentiation

selectively changing the performance of network traffic

- Reasons for differentiation:
  - ▣ traffic engineering
  - ▣ bandwidth management
  - ▣ business reasons



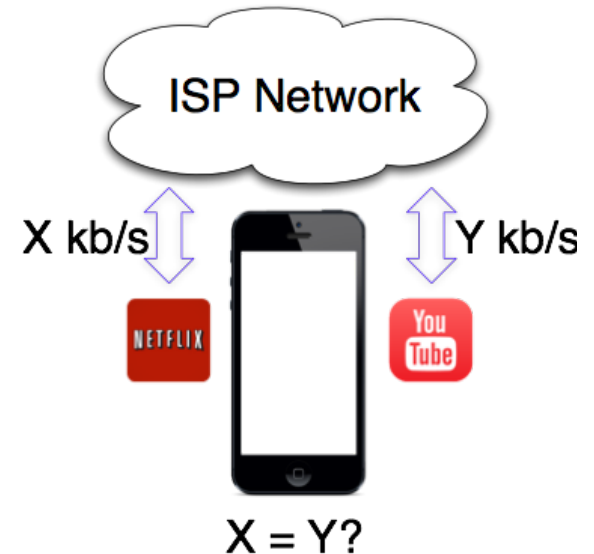
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Do certain types of network traffic receive  
**better (or worse) QoE?**

# Motivation: Differentiation in the wild

3

□ Tested in early 2015

ISP	YouTube	Netflix	Spotify
Verizon	m	m	m
Tmobile	-	-	-
ATT	m	m	m
Sprint	m	m	m
Boost	m	m	m
BlackWireless	60%	-	-
H2O	37%	45%	65%
SimpleMobile	36%	-	-
NET10	p	p	p

- m: content modified on the fly
- p: translucent proxies change connection behavior

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# Motivation: Differentiation in the wild

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- Tested in early 2015
- Again in late 2015: No observed differences

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Tmobile	-	-	-
ATT	m	m	m
Sprint	m	m	m
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# Key Questions

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What do you test for differentiation?

- ▣ How do you generate traffic?
- ▣ What triggers differentiation?

How can you *tell* if there is differentiation?

- ▣ How do you do a controlled experiment?
- ▣ How do you rule out other reasons for differential service?

What is the *impact* on QoE?

- ▣ How do you map observed degradation to QoE?
- ▣ How do you scale this to arbitrary applications?



# How do you test for differentiation?

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- What triggers differentiation?
  - *We don't know*

- They might trigger on
  - IP addresses
  - ports
  - payload signatures
  - total number of connections
  - total bandwidth
  - time of day

*(This is consistent with online manuals for DPI boxes)*

# How do you test for differentiation?

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- What triggers differentiation?
  - *We tested using carrier-grade DPI boxes*
- They might trigger on
  - IP addresses
  - **ports**
  - **payload signatures**
  - total number of connections
  - total bandwidth
  - time of day

# What triggers differentiation?

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- HTTP
  - ▣ **Host:** and **GET** fields, typically **regex**
  - ▣ Examples: youtube, facebook, netflix
  
- HTTPS
  - ▣ Server cert is sent in plaintext
  - ▣ Searches on **SNI, CN** fields
  
- Other protocols
  - ▣ Can identify Skype using some knowledge of handshake format
  - ▣ **Open question:** how to reverse engineer classifiers?
  
- What is **not** important
  - ▣ IP addresses don't seem to matter!

# Triggering differentiation

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8

**NETFLIX**

# Triggering differentiation

8



end user

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end user



# Triggering differentiation

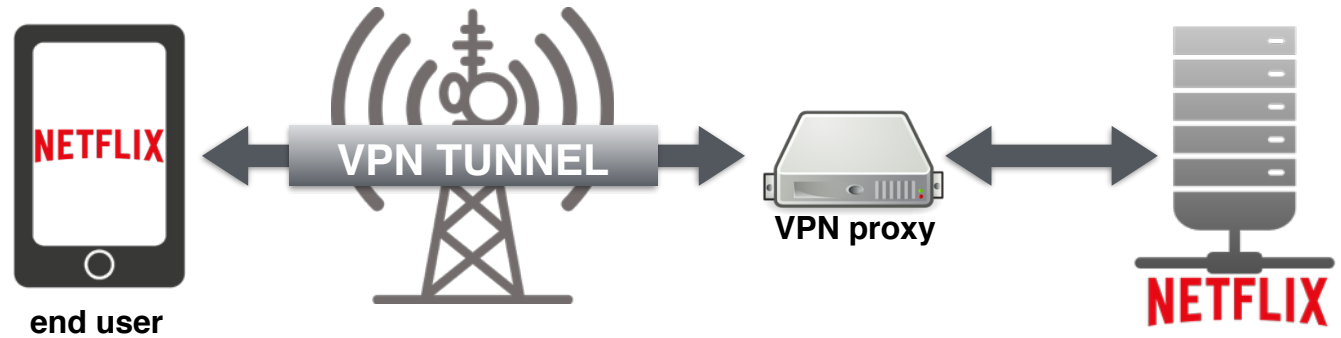
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# Triggering differentiation

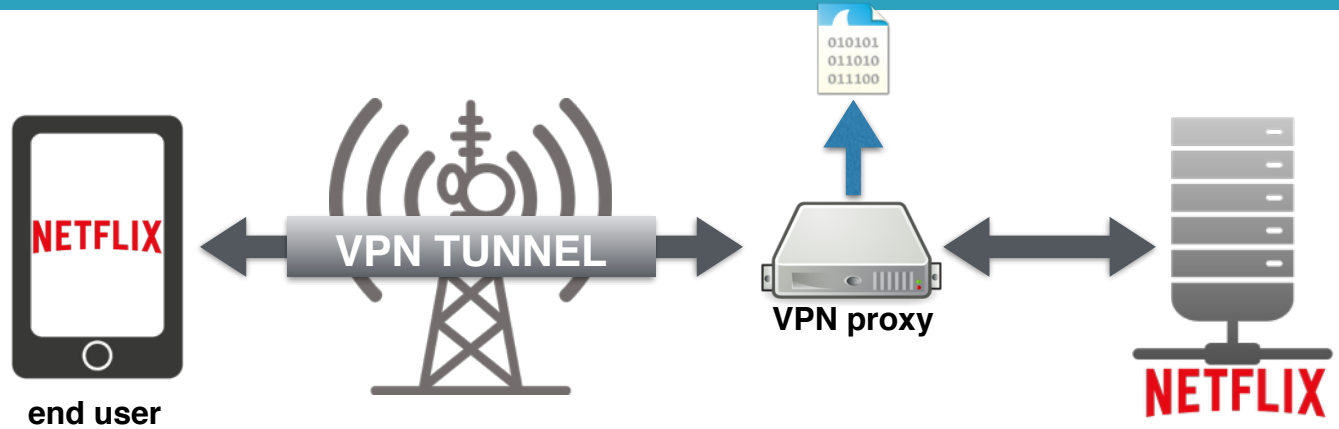
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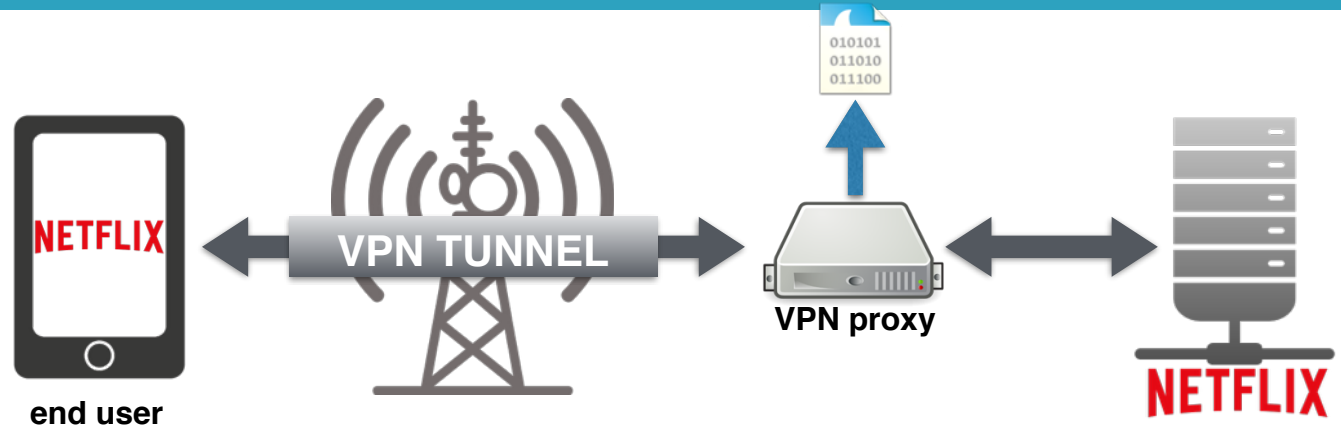
Record:



# Triggering differentiation

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**Record:**

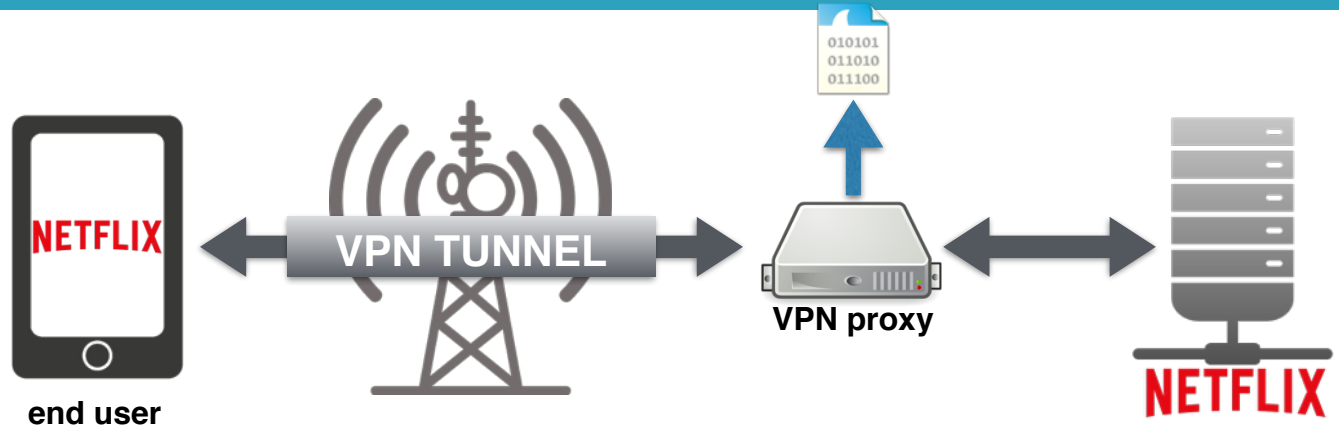


**Replay:**

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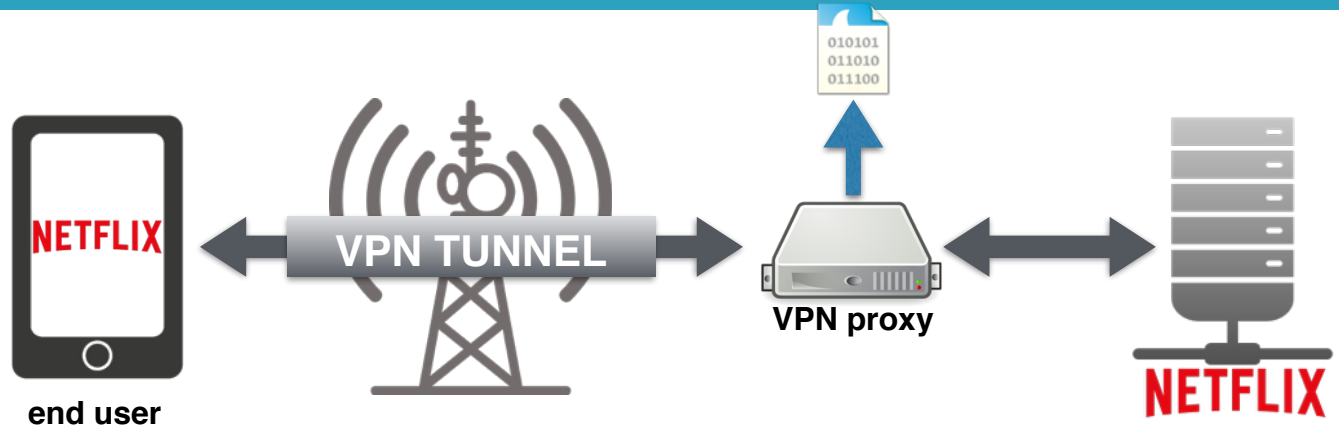
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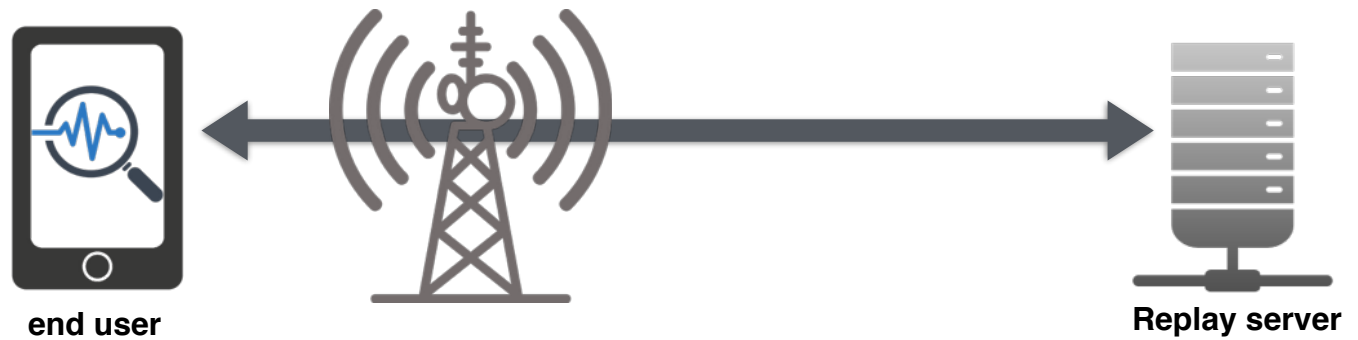
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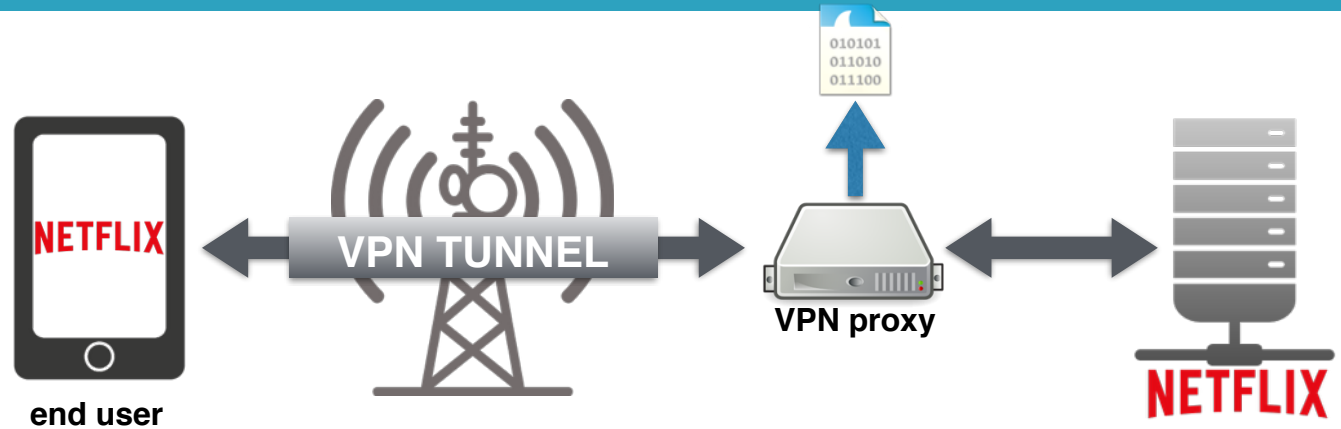
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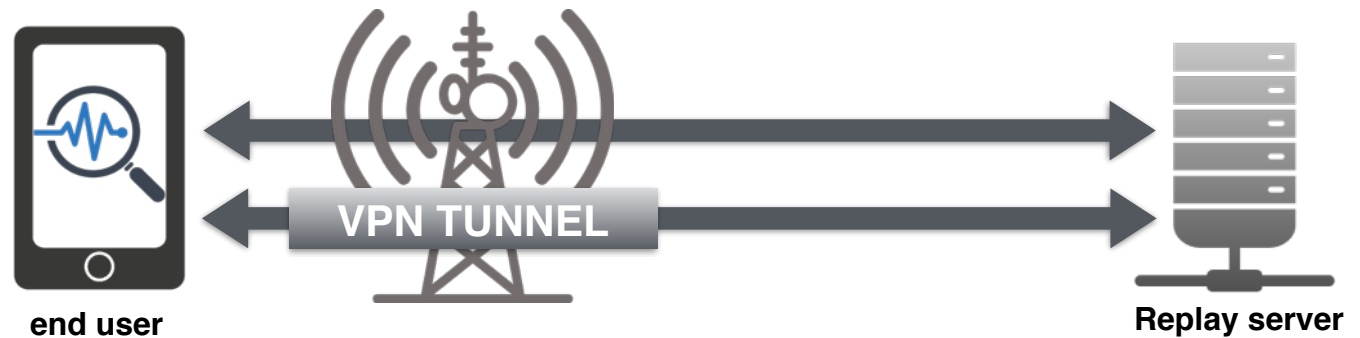
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**Replay:**



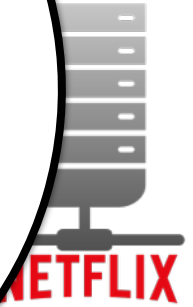
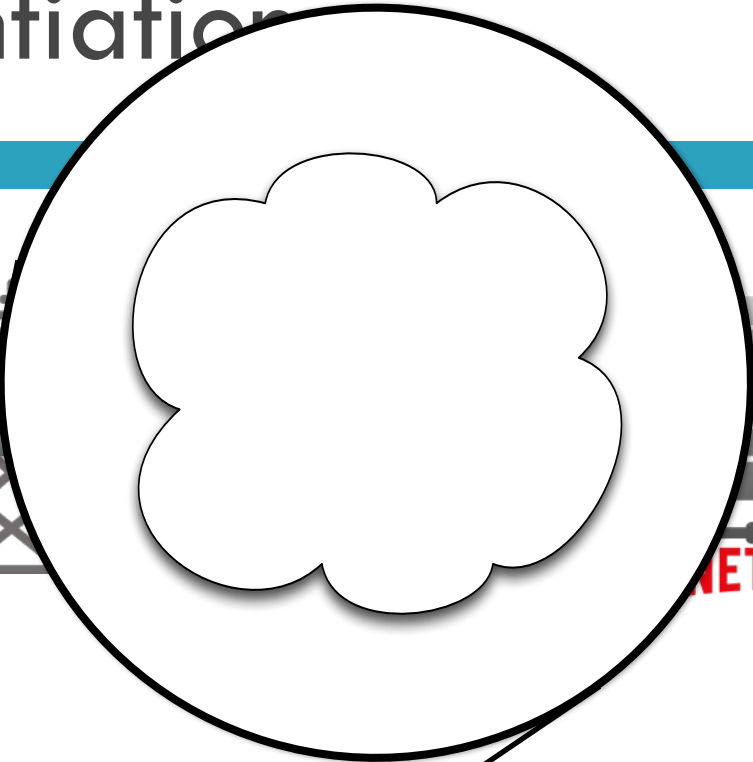
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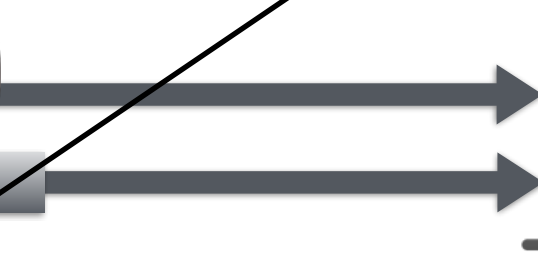
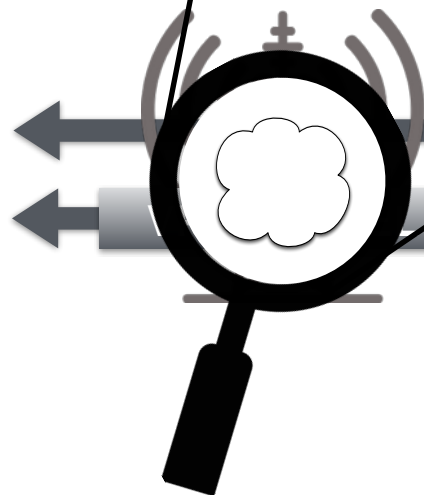
end user



**Replay:**



end user



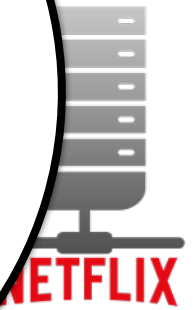
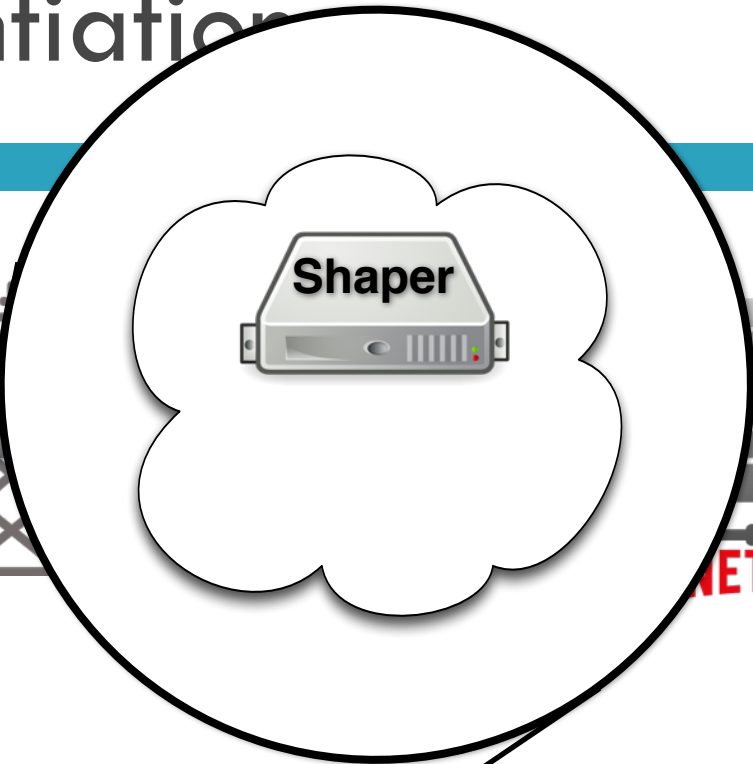
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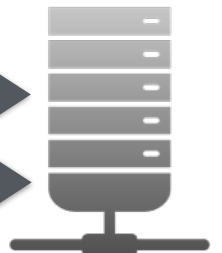
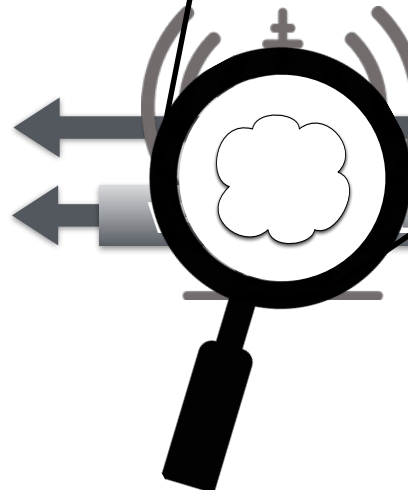
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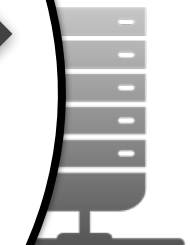
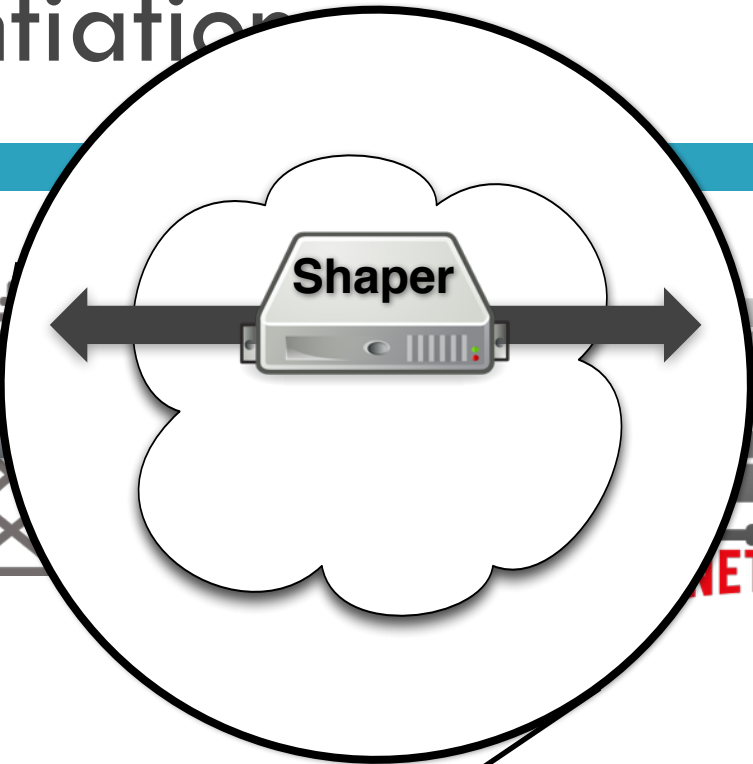
**Record:**



end user



VPN

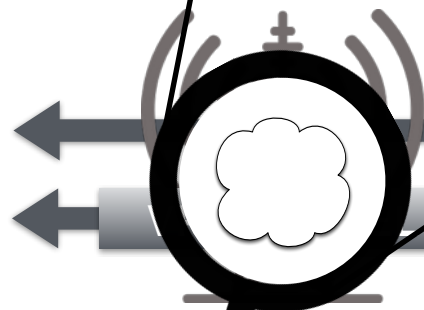


NETFLIX

**Replay:**



end user



Replay server

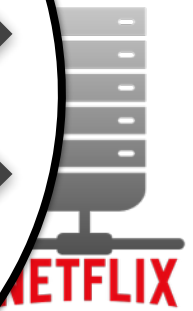
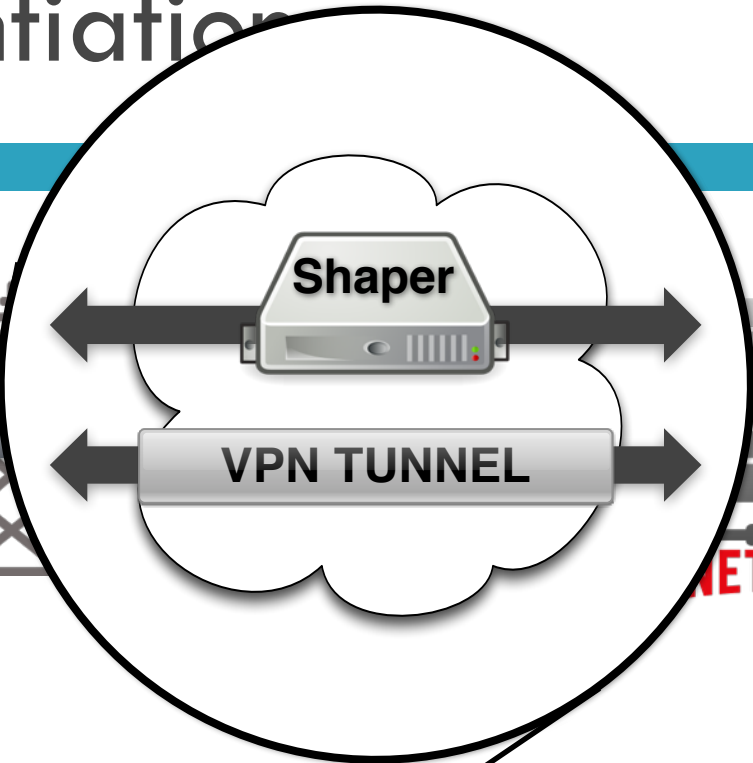
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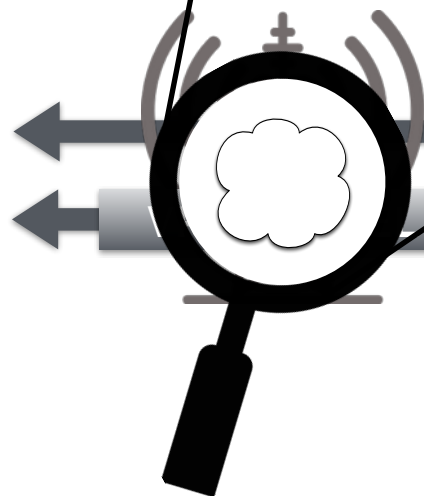
end user



**Replay:**



end user



# How to tell if there is differentiation?

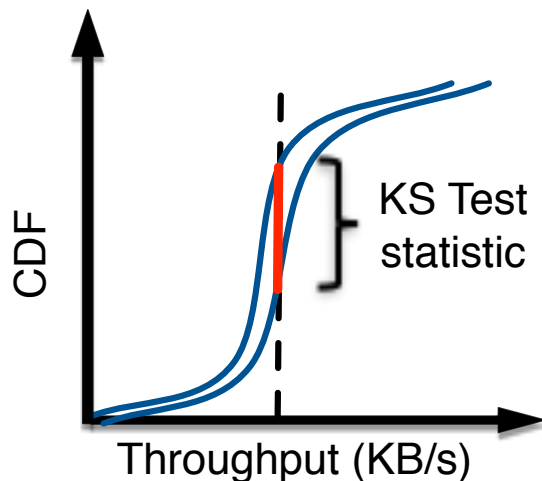
9

- Developed and validated new detection technique
  - Back-to-back tests of same trace
    - Includes VPN and random payload (but not ports)
  - Send only at recorded rate (this is not a speed test)
  - Statistical tests to reliably find differentiation

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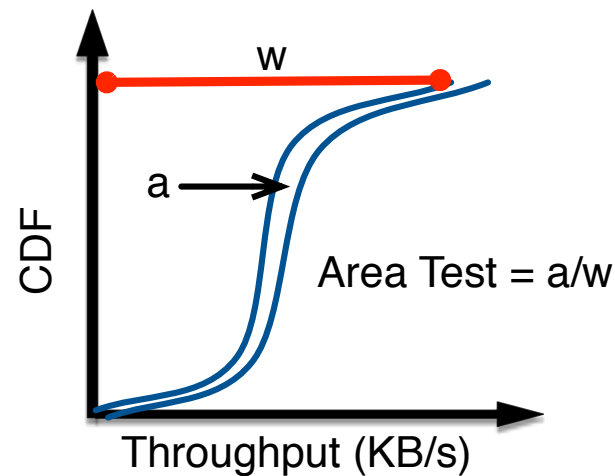
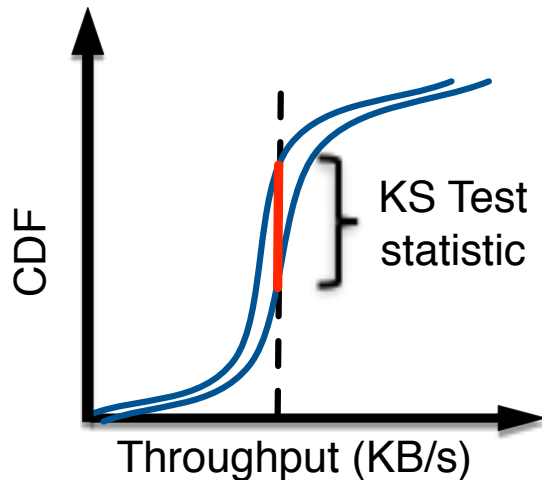
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# Mapping to QoE

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- Currently measure throughput, loss, delay, jitter
  - ▣ Some clear mappings to video streaming **bitrate**
  - ▣ Fairly clear mapping to VoIP
  - ▣ ... but unclear how it impacts user-perceived performance
- Key challenge: Applications are **adaptive**, servers **dynamic**
  - ▣ Users may not perceive impairment
- Current focus: Expose QoE metrics
  - ▣ YouTube does this, Netflix does not
  - ▣ What is the right format?
  - ▣ How do we know if users notice?

# Summary

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- Differentiation and its impact on QoE important to solve
- Detecting differentiation requires care
  - ▣ What you send (trigger it), how you send it (avoid it)
  - ▣ Detection approach should be resilient to noise
- Need a deeper understanding of impact on QoE
  - ▣ Adaptive applications pose a challenge
  - ▣ Potential approach is combination of
    - ▣ Exposing more QoE data from applications
    - ▣ Building better models to map QoS to QoE

# Questions?

<http://dd.meddle.mobi>

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