



Decoding Cellular Walled Gardens

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Let's start with a scenario



8:00 AM morning commute



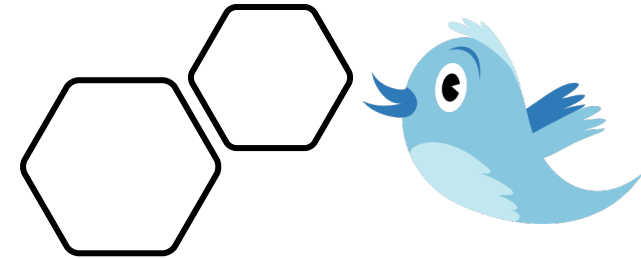
Hwy 101



No cellular connection



TE



WSJ

Where is my internet?!

Mobile Internet

Global mobile data
~ 75 exabytes per month (2022)

Mobile traffic (last 5 years)

↑ 222%*

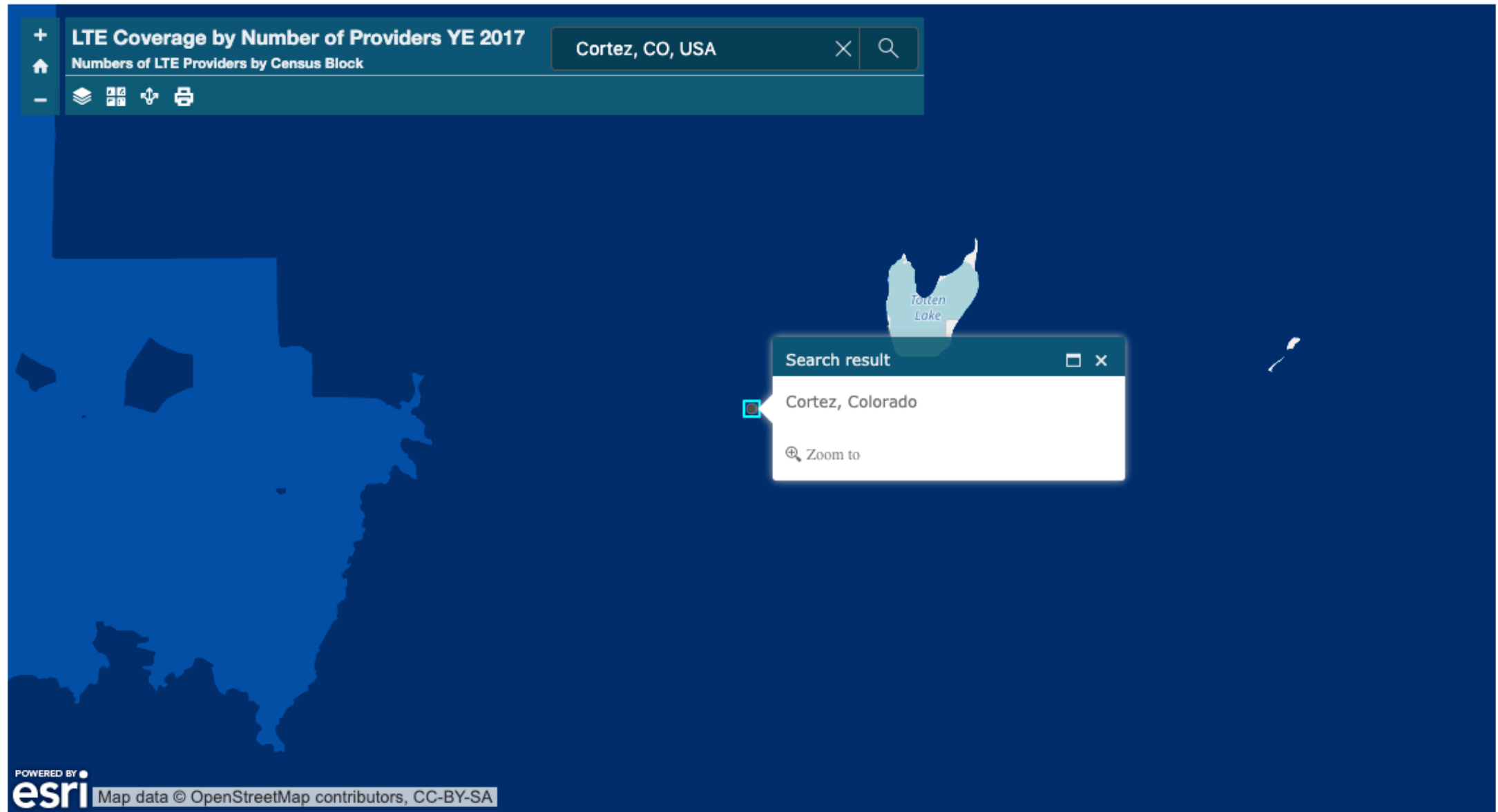
Cellular Networks

- ~4 Billion LTE users by end of 2020
- Escalating user base
 - Challenges in sustaining consistent, high-quality service
- Adequate coverage \neq useable service
- Sudden surge in traffic demand
 - Large gatherings
 - Post-disaster scenarios

Natural Disasters

- 12 major tropical storms have hit the US in the past 4 years
- Destruction on a massive scale
- Hurricane Maria (Puerto Rico)
 - Knocked out 95% network infrastructure
- Hurricane Dorian
 - 'Unprecedented' devastation in Northern Bahamas¹

LTE Coverage by Number of Providers - YE 2017



Source: FCC

Third Party Assessment



NETWORK
QUALITY



NETWORK
ACCESSIBILITY

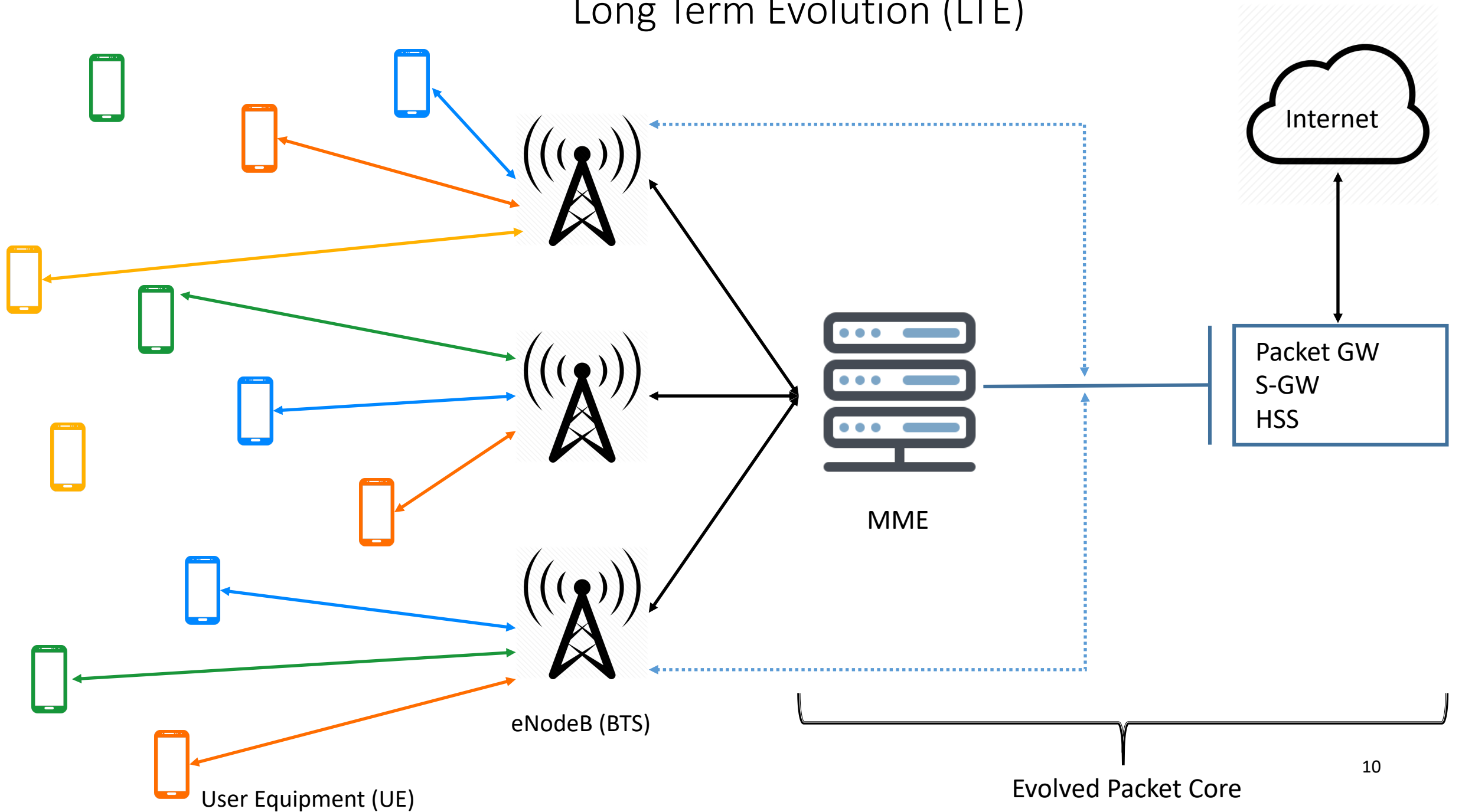


VERIFYING PROVIDERS'
CLAIMS

Roadmap

- ➔ • Estimating Overload in LTE Networks (IMC '19)
 - LTE basics
 - Motivation
 - Overload detection
- Quality of Experience on Mobile Broadband (ongoing)
 - QoE on LTE
 - Measurement campaigns

Long Term Evolution (LTE)



Third Party Assessment

Typical solutions



Cooperation of telecom providers



Active measurements through multitudes of mobile devices

Problem.

01

Existing solutions
are resource and
time intensive

02

May not be
practical

03

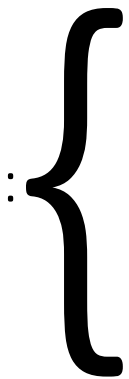


What if passive
measurements
could help?

Research Question

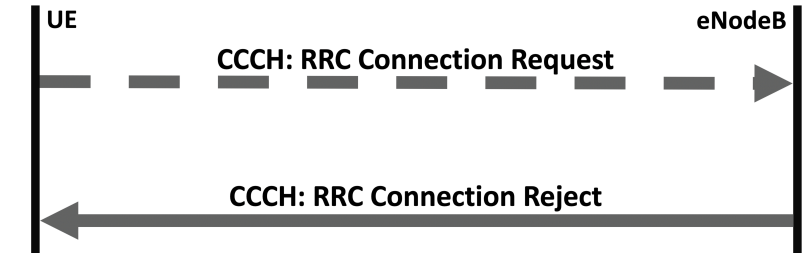
Can we use off the shelf equipment to enable third party assessment of cellular availability and network quality?



Estimating Overload

- Connection request:   Connection Accept
-  Connection Reject

- Key to reducing overload = Deny access
- eNodeBs (BS) broadcast “rejects”



Channel Type	RLC Mode
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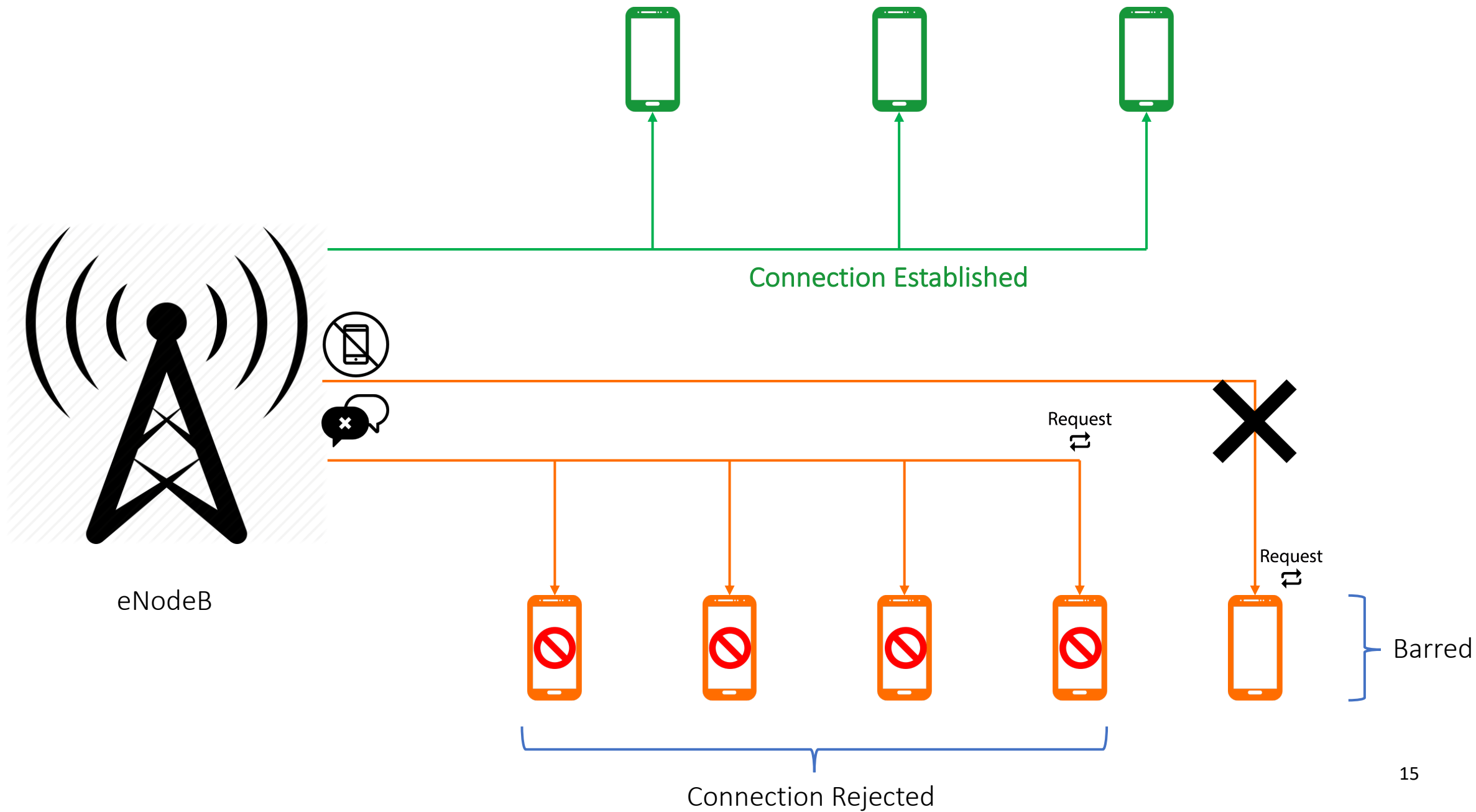
CCCH	Transparent (Decodable from passive capture)
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Direction	RRC Message
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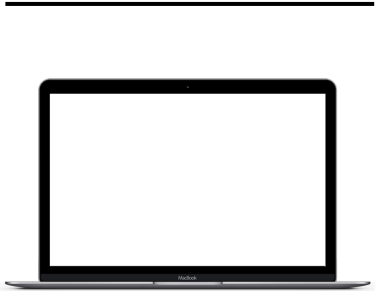
Downlink	Connection Setup Connection Reject
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Uplink	Connection Request
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Signaling Radio Bearers (SRB0)



- Quantify the number of reject and request messages
- Non-intrusive, federally compliant
- Off-the-shelf equipment



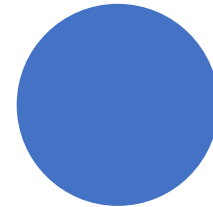
Linux box



USRP



LTE antenna



Datasets

Dataset	Location	Date	# LTE frames	Capture duration
St. Patrick's day parade (SPD)	Balboa Park, SD	3/16/2019	1.1 Million	76 minutes
Concert shamrock (CSR)	Downtown SD	3/16/2019	1.7 Million	113 minutes
St. Patrick's day parade baseline (SPD_base)	Balboa Park, SD	3/26/2019	275K	65 minutes
Concert shamrock baseline (CSR_base)	Downtown SD	3/26/2019	135K	60 minutes

 T-Mobile®

 verizon✓

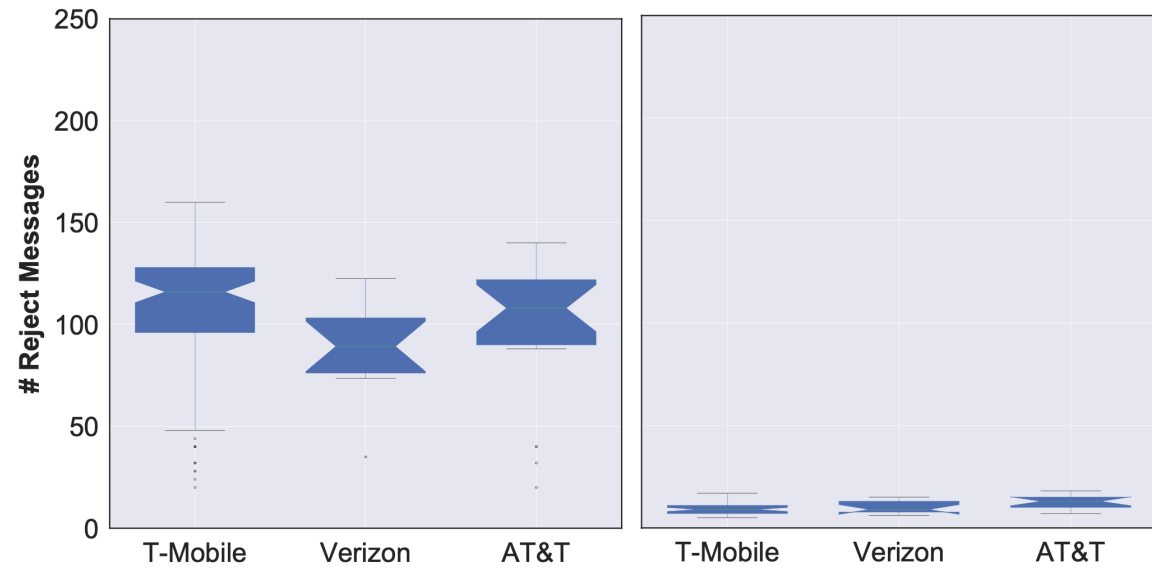
 AT&T



Evaluation

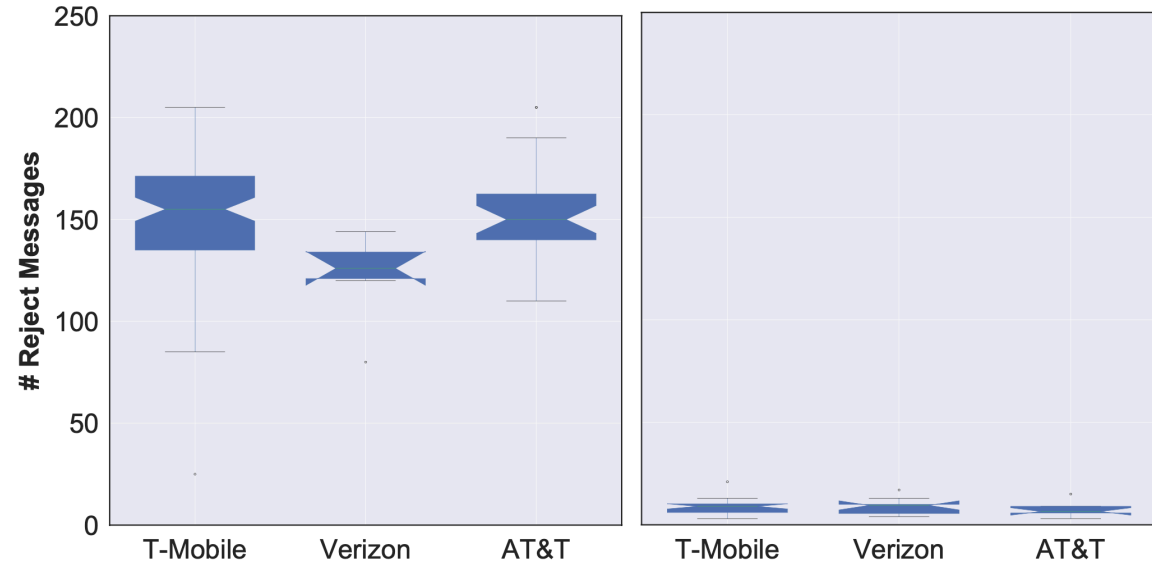
of Connection Rejects

- Significantly more rejects in SPD and CSR
 - 8X in SPD
 - 15X in CSR
- Bin size: 30 seconds



(a) SPD

(b) SPD_base



(c) CSR

(d) CSR_base



$\Phi = \text{Rejects/Requests}$



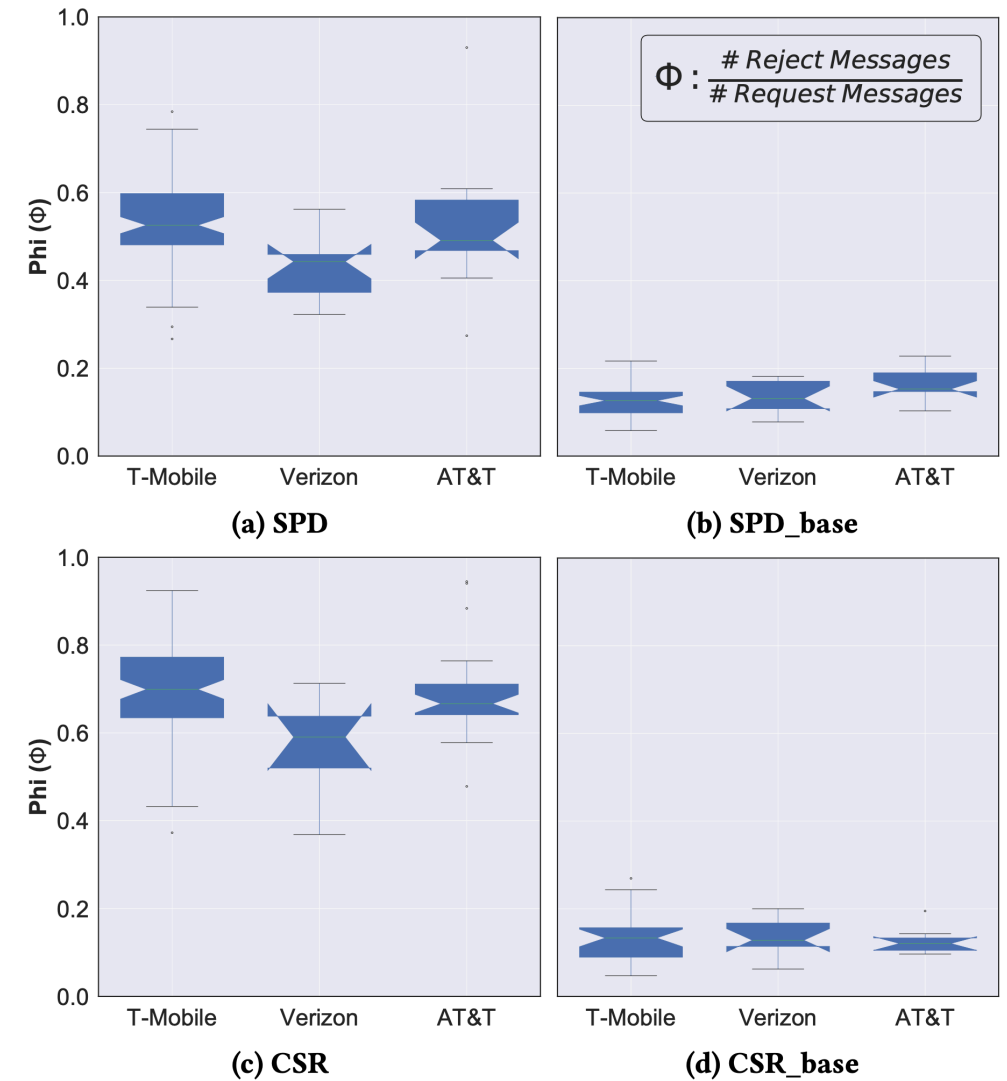
Indicates the severity of overload



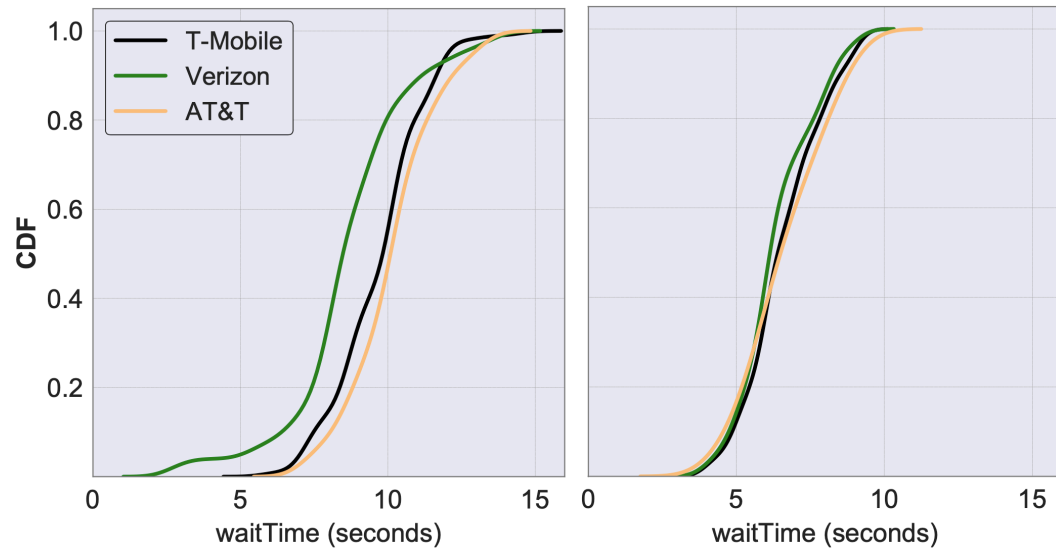
Bin size: 30 seconds



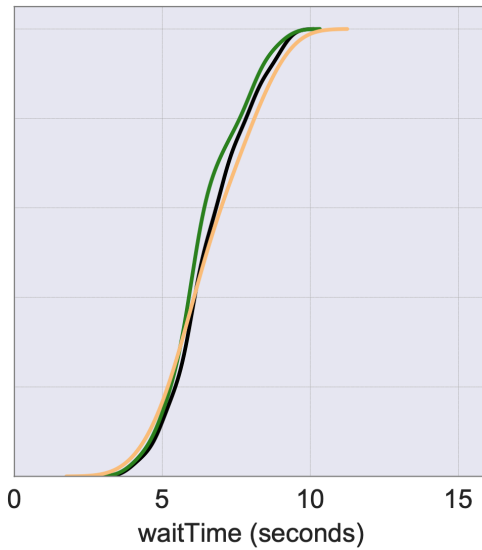
Φ (SPD, CSR) is consistently higher



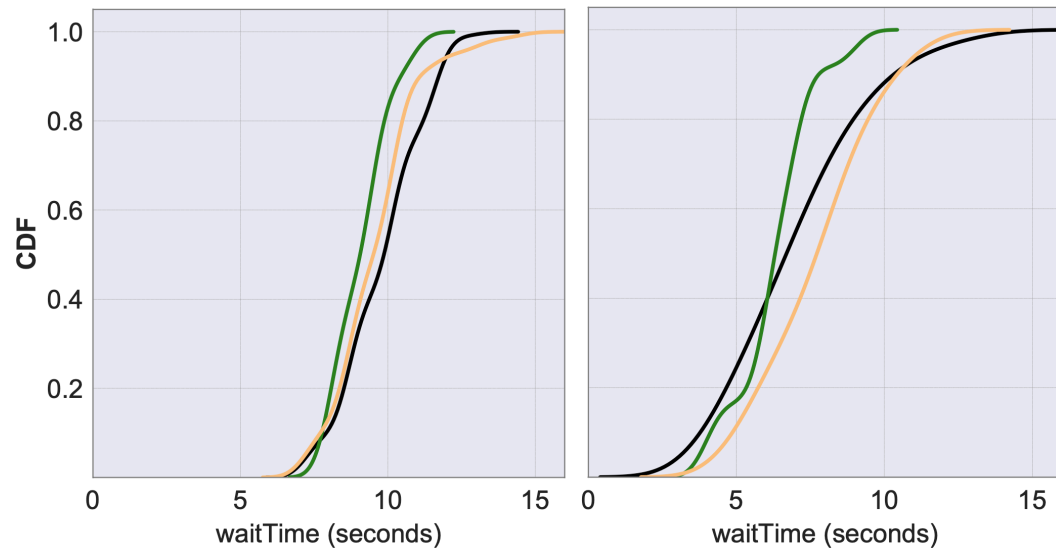
Phi Measure



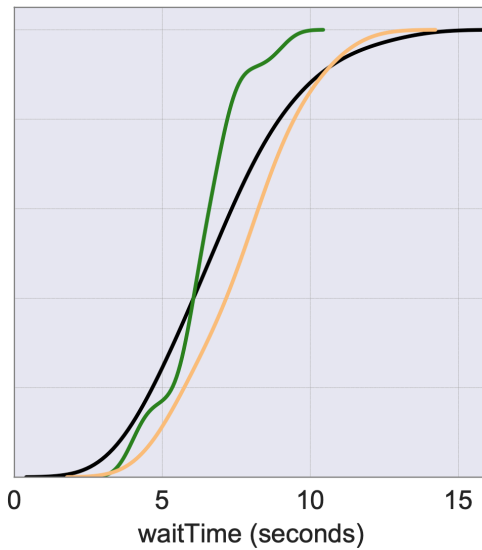
(a) SPD



(b) SPD_base



(c) CSR



(d) CSR_base

waitTime

- waitTime: Back-off time before reconnection attempt
- Contained within every reject message
- Part of overload mitigation scheme
- Longer waitTime in SPD, CSR

Omega Measure



Contained in SIB1 messages
cellBarred flag: UE is not allowed to camp on a particular cell

Ω

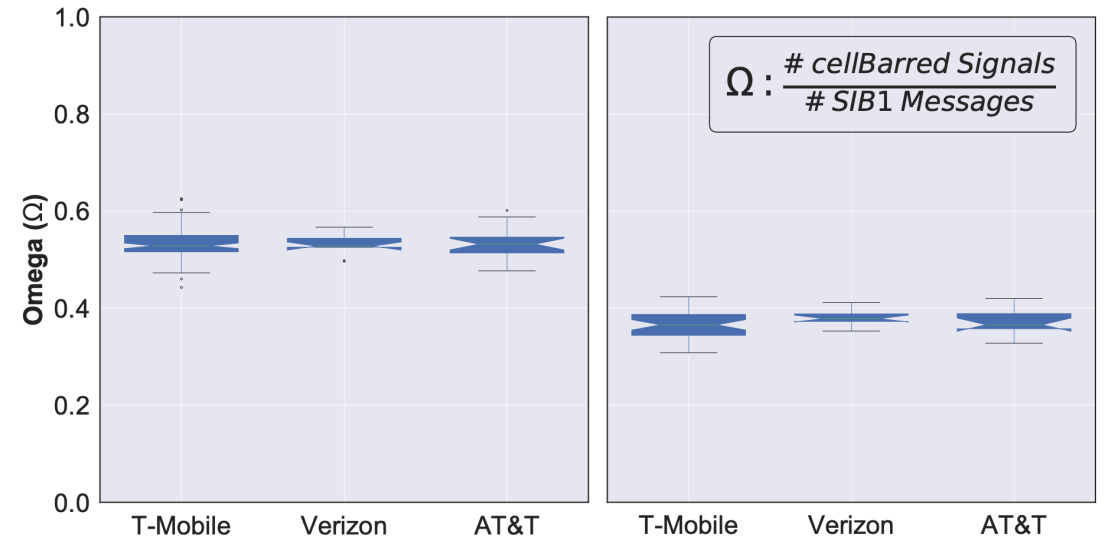
$$\text{Omega} = \frac{\# \text{ cellBarred signals}}{\# \text{ SIB1 messages}}$$



20% increase in SPD, CSR

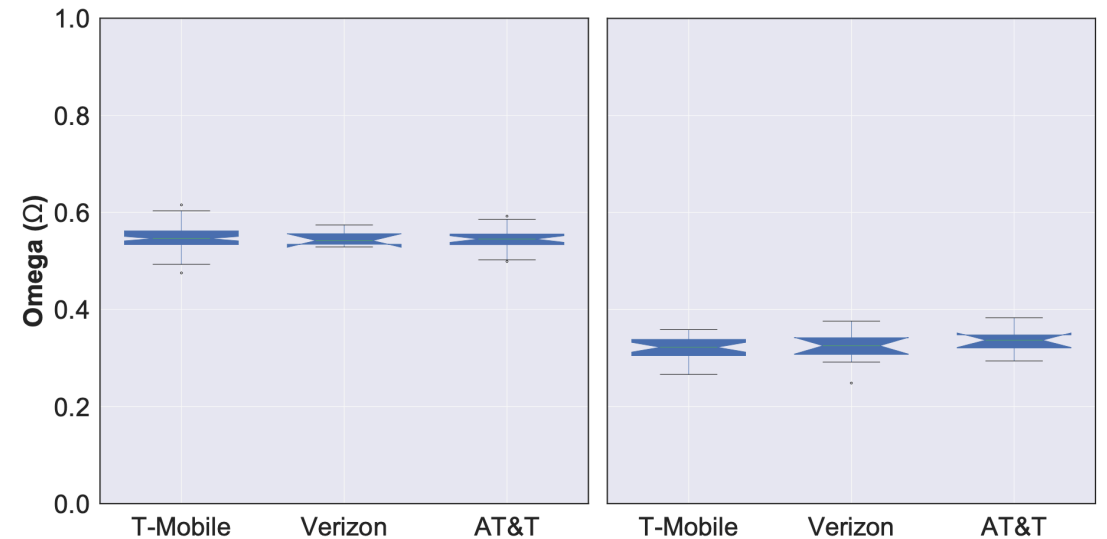


Positive correlation between
Omega and overload



(a) SPD

(b) SPD_base



(c) CSR

(d) CSR_base

Takeaway

We develop a third-party network assessment system to estimate overload that is:



Operator
agnostic

Scalable

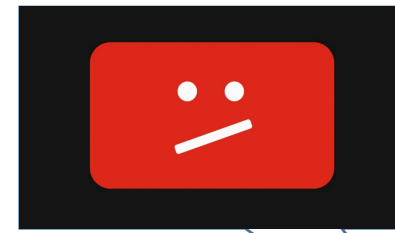
Uses low-cost,
off-the-shelf
equipment

Roadmap

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- ➔ • Quality of Experience on Mobile Broadband (ongoing)
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Quality of Experience



Three quarters of
global traffic is
video

Domain filled with
prior work

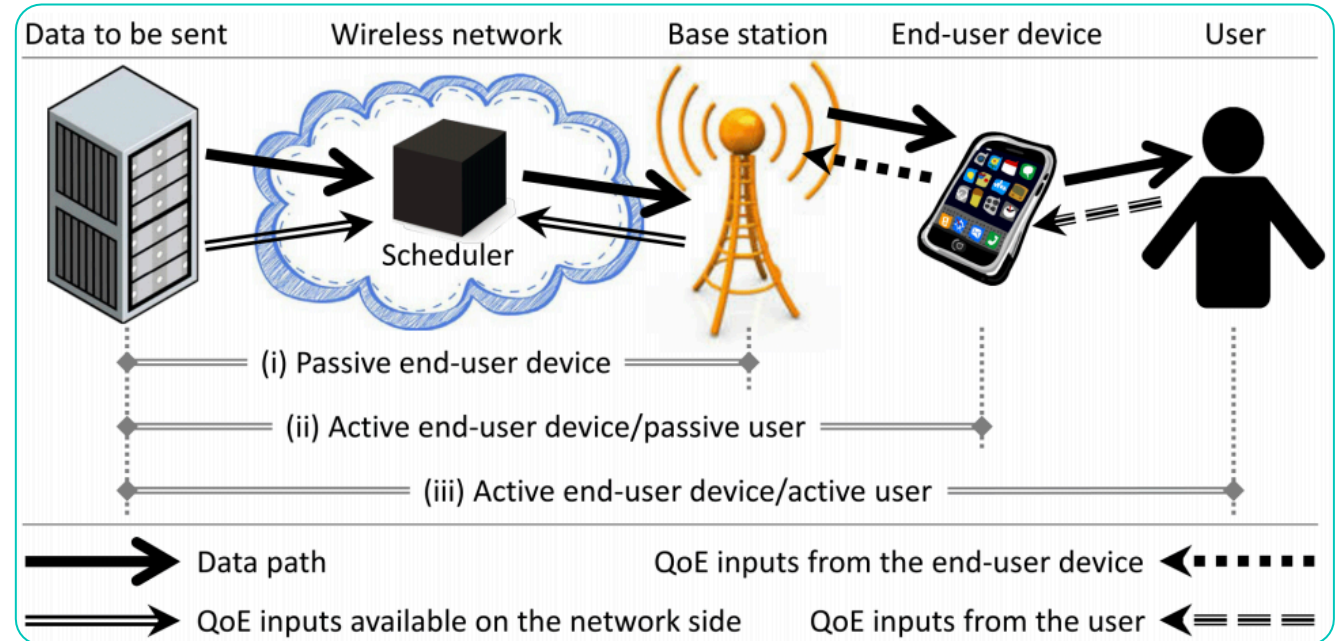
Drawbacks:
Limited scope
Platform dependency

Scalability

*[SST17]
[Gup+19]
[MNA17]*

Vantage Points

- Perspective from within the network
- Discernable insights about the network state



Taken from Sousa et al. [SQR19]

But which one to choose?

Is that enough...?

Not always.



Accuracy

How representative
the metrics are



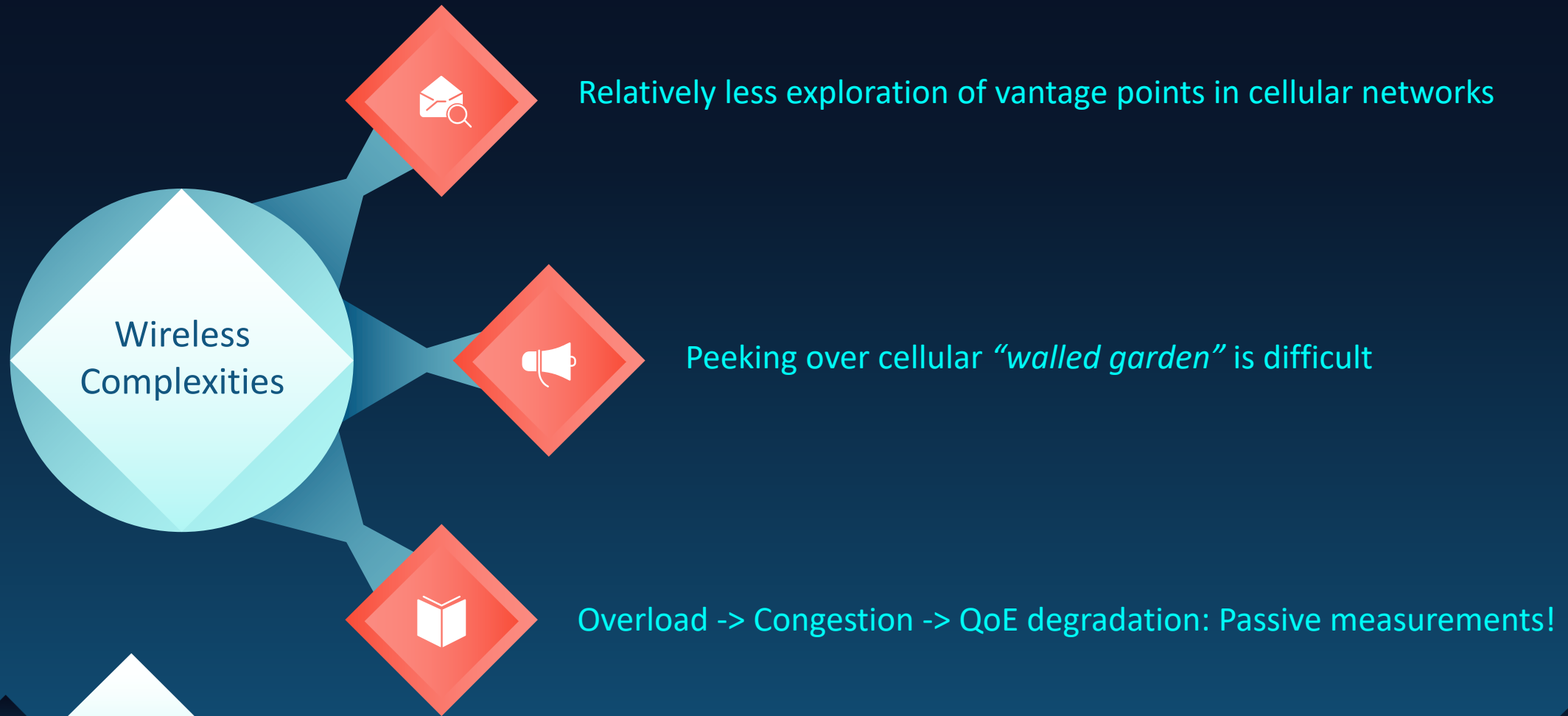
Responsiveness

Delay in system's
reaction



Design Philosophy

Minimize $\frac{\text{Responsiveness}}{\text{Accuracy}}$



Research Question

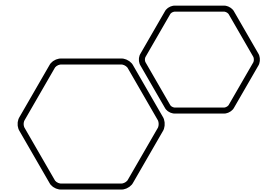
Can over the air passive measurements be used to estimate the quality of experience at the user end?

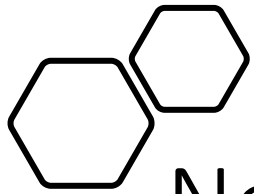


Measurement Campaigns



Tribal Lands – Southern California





Northwestern New Mexico

- Extensive measurement campaign
- Team of 4 PhD students
- Weeklong measurement drive

Dataset

- Over 200 GB of packet traces
- ~ 1 million temporally varying radio measurements



Locations

New Mexico

Tribal, Rural

Non-Tribal, Rural

Non-Tribal, Semi-Urban

DATASET

QoE

YouTube (Video Streaming)

Page Load Time

Skype (Video Telephony)

**Radio
Measurements**

RSRP (Signal Strength)

DATASET

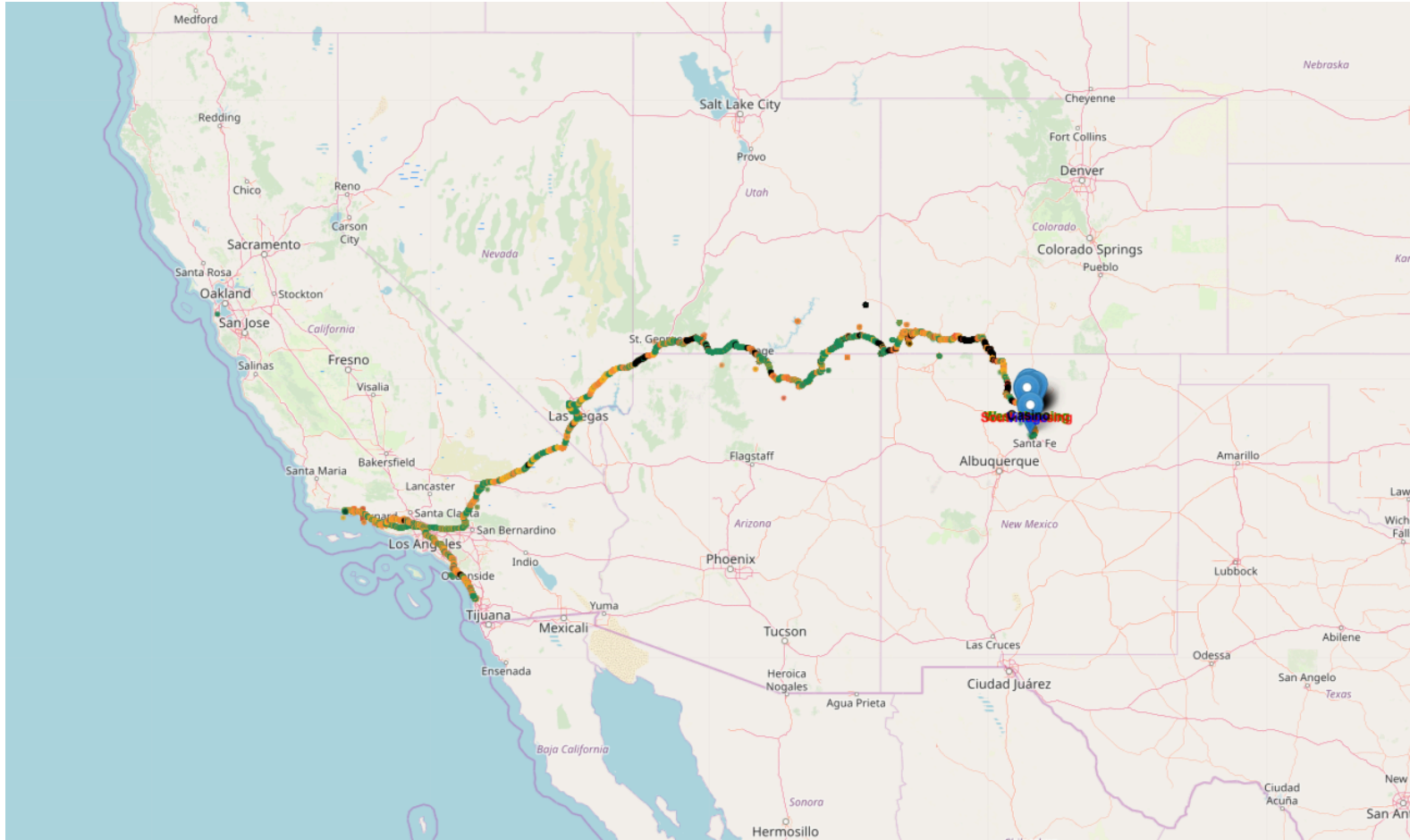
QoS

Throughput

RTT

Packet Error Ratio

DATASET



LTE COVERAGE MAP

- 6 states
- 2665 miles driven
- 4 major telecom operators
- Over 200,000 “*ground truth*” datapoints



Field work is challenging
but quite rewarding.

This work would not have been possible without my collaborators.

Prof. Elizabeth Belding (UCSB)

Prof. Ellen Zegura (GaTech)

Prof. Arpit Gupta (UCSB)



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<https://vivekadarsh.com>

References:

- **[SST17]**: "Beauty and the Burst: Remote identification of encrypted video streams." *USENIX Security 2017*.
- **[Gup+19]**: "Requet: Real-time QoE detection for encrypted YouTube traffic. *MMsys 2019*.
- **[MNA17]**: "Neural adaptive video streaming with Pensieve." *Conference of the ACM Special Interest Group on Data Communication 2017*.
- **[SQR19]**: "A survey on QoE-oriented wireless resources scheduling." *arXiv preprint arXiv:1705.07839 (2017)*.
- **[STA19]**: <https://www.statista.com/statistics/277125/share-of-website-traffic-coming-from-mobile-devices/>

Thank you

