

# Rate Adaptation for Multiuser MIMO Networks

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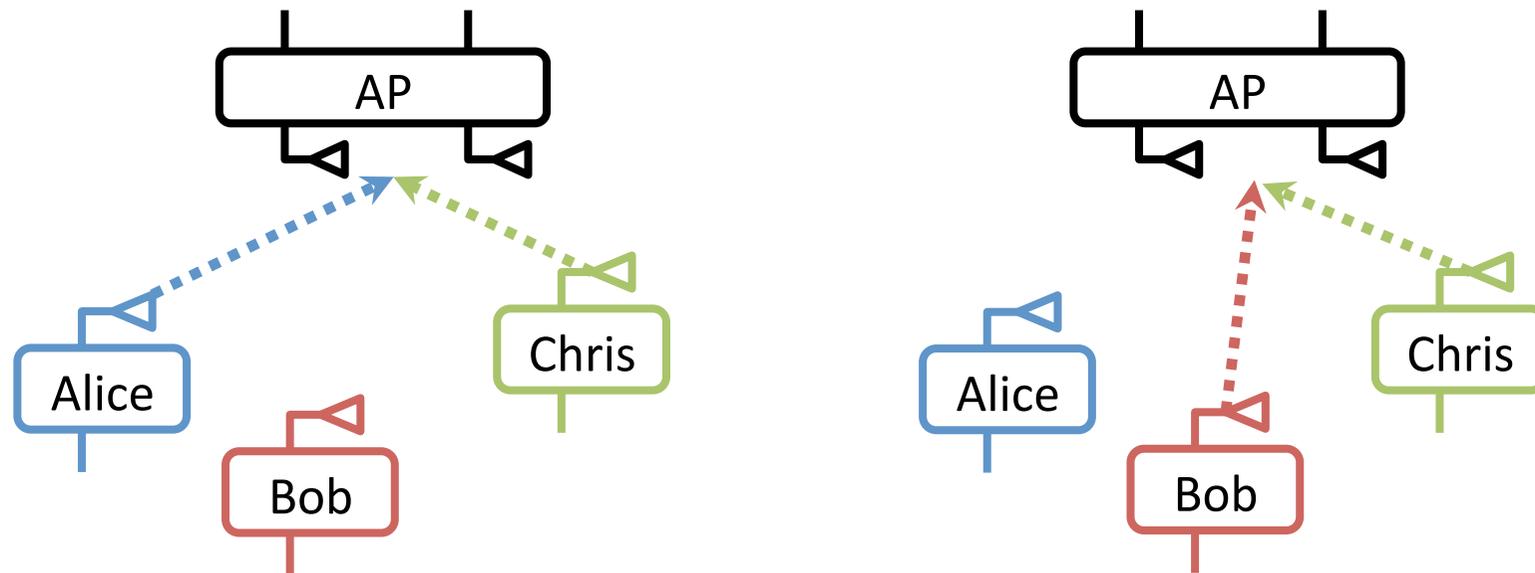


# Multuser MIMO Allows Concurrent Streams



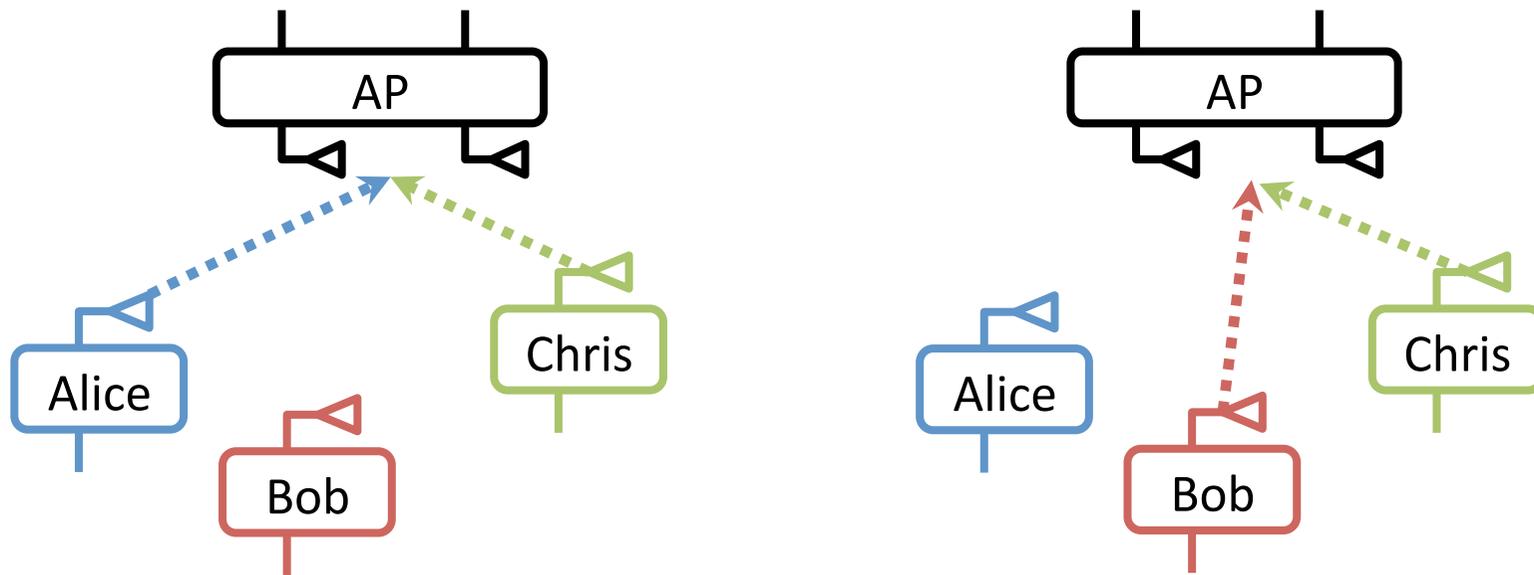
Clients contend for concurrent transmissions opportunities [K. Tan, MOBICOM'09]

# A Client Could Transmit Concurrently With Different Clients



Traditional historical-based rate adaptation  
doesn't work → **Why?**

# Best Rate Changes with Concurrent Client



Chris's best-rate depends on

Chris's best rate also changes packet to packet

- but also Alice's/Bob's channel

# Goal

Enable clients to adapt their rates  
*on a per-packet basis*



**TurboRate**

# TurboRate

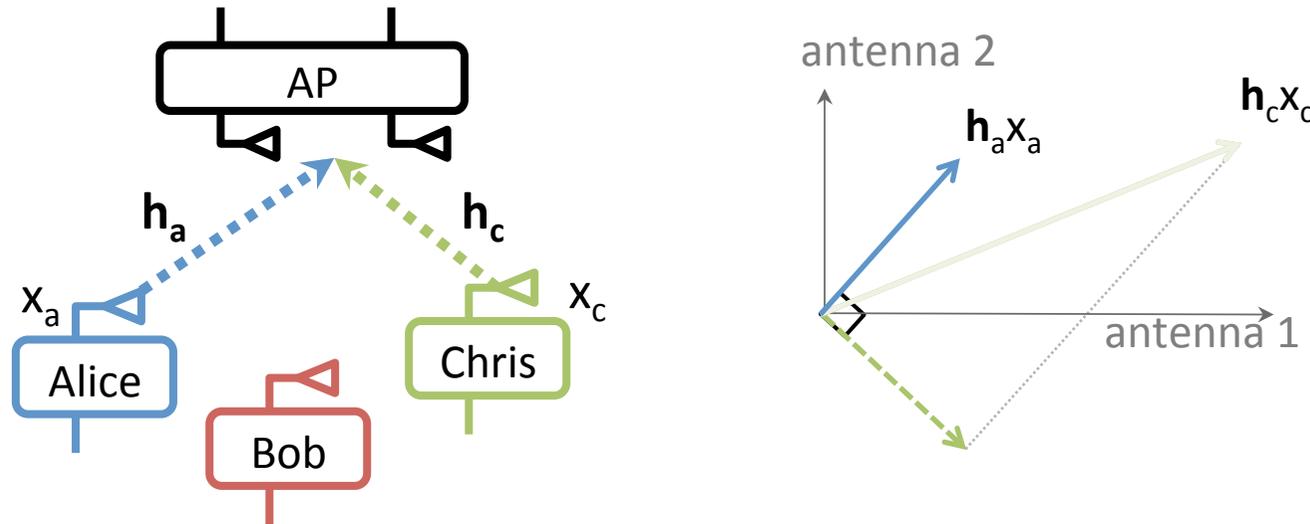
- Allow clients to adapt their best rates by
  1. reacting to interaction between concurrent clients
  2. learning their rates passively without coordination
- Implemented and shown to deliver the gain of multiuser MIMO (MU-MIMO)

# TurboRate

- Allow clients to adapt their best rates by
  1. reacting to interaction between concurrent clients
  2. learning their rates passively without coordination

# How Concurrent Clients Interact?

## How Does the AP Decode Streams? ZF-SIC



Decode Chris by **Zero-Forcing (ZF)**

- Project orthogonal to Alice

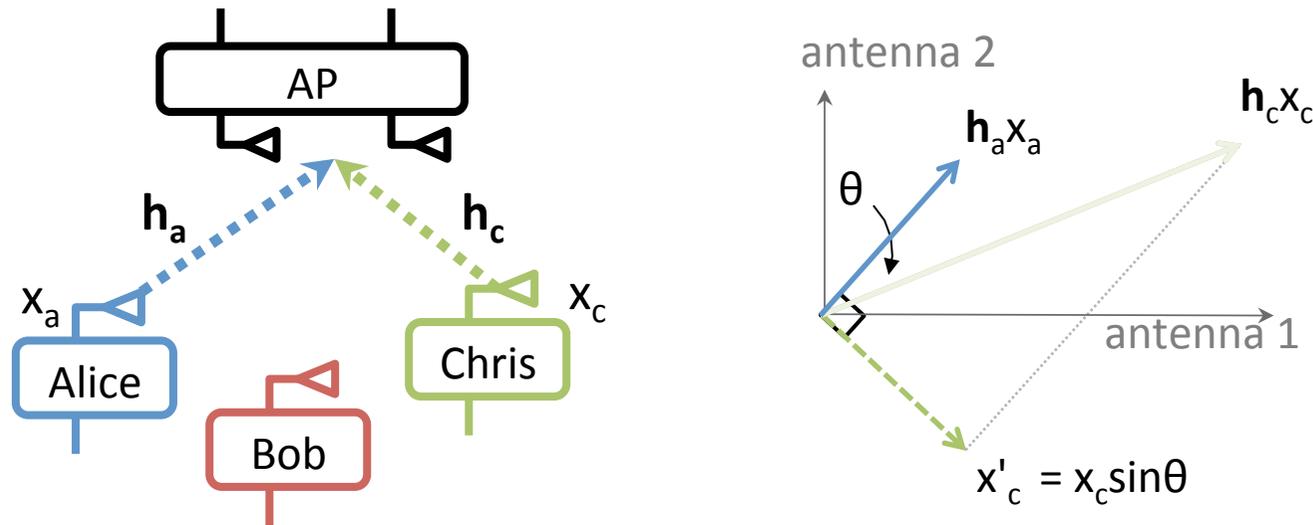
Decode Alice by **Successive Interference Cancellation (SIC)**

- Remove Chris's interfering signal

Alice can only be decoded if Chris is decoded correctly

# How Concurrent Clients Interact?

## How Does the AP Decode Streams? ZF-SIC



Decode Chris by **Zero-Forcing (ZF)**

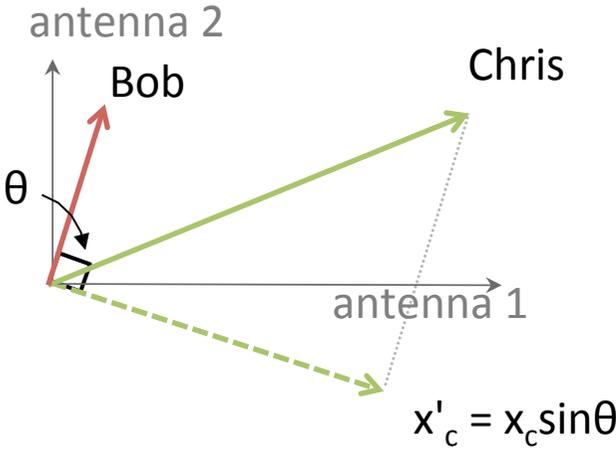
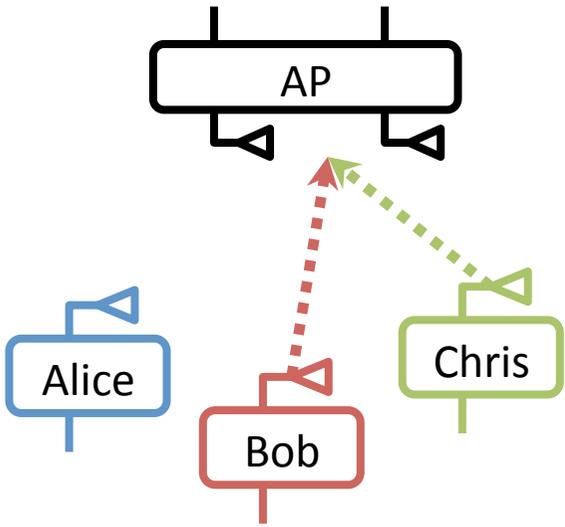
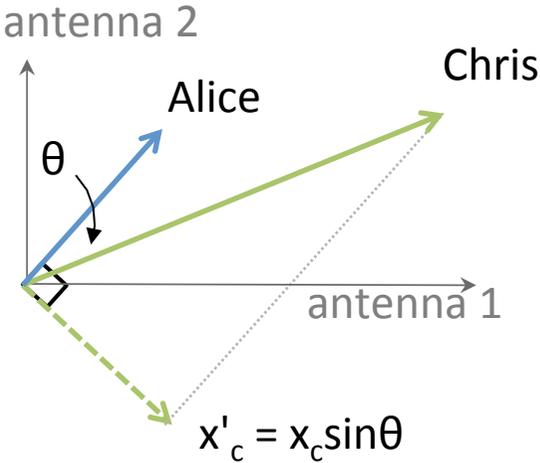
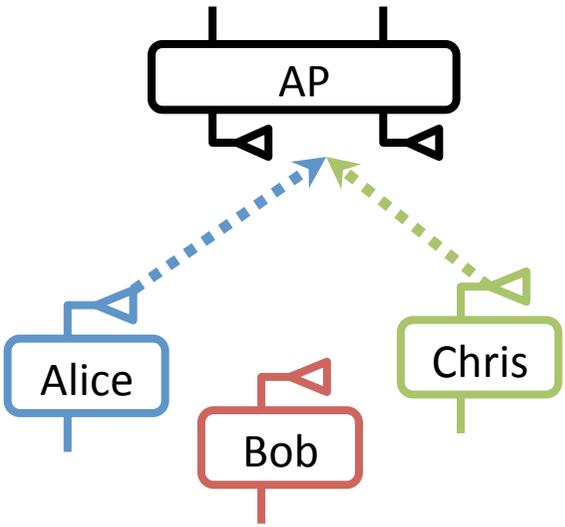
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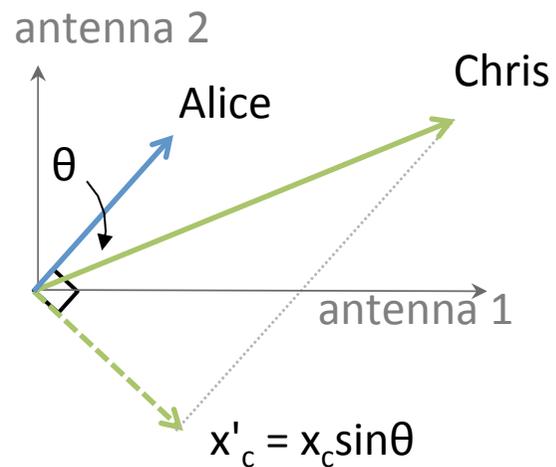
SNR reduction after projection

# Concurrent Client Might Change

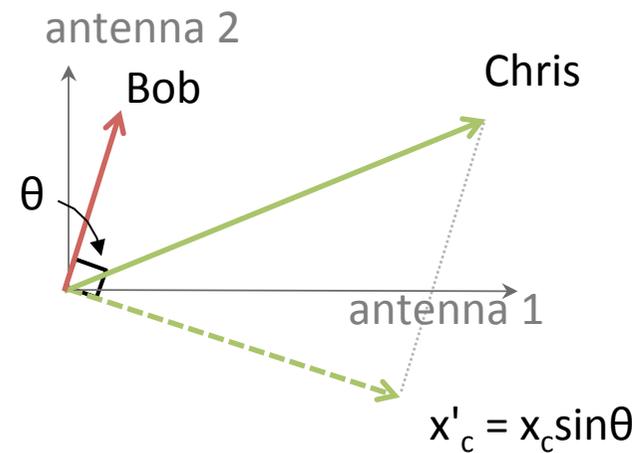


# SNR<sub>proj</sub> Changes with Concurrent Client

Select a lower bit-rate

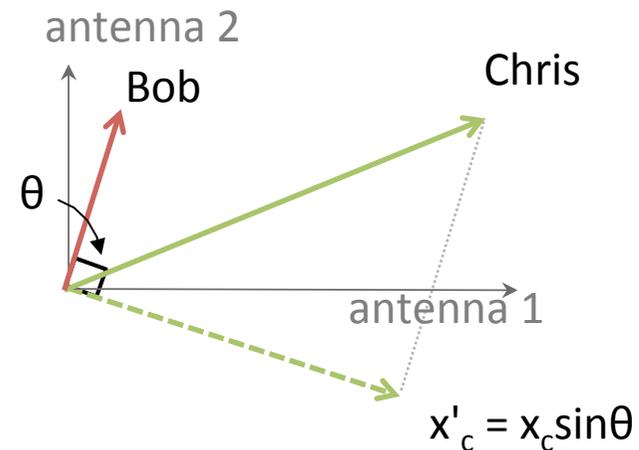
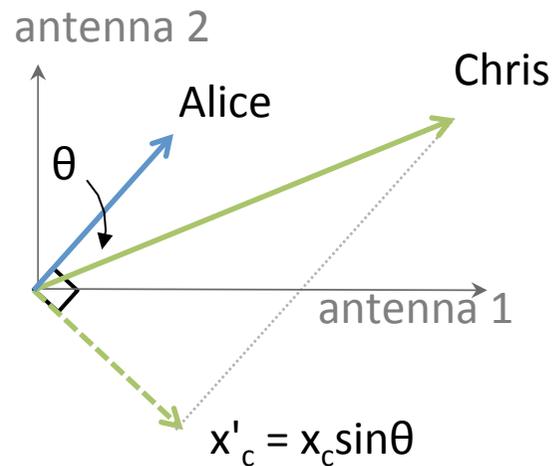


Select a higher bit-rate



# Per-Packet Bit-Rate Selection

- Map  $\text{SNR}_{\text{proj}}$  to the best bit-rate
  - ESNR-based rate adaptation [D. Halperin, SIGCOMM'10]

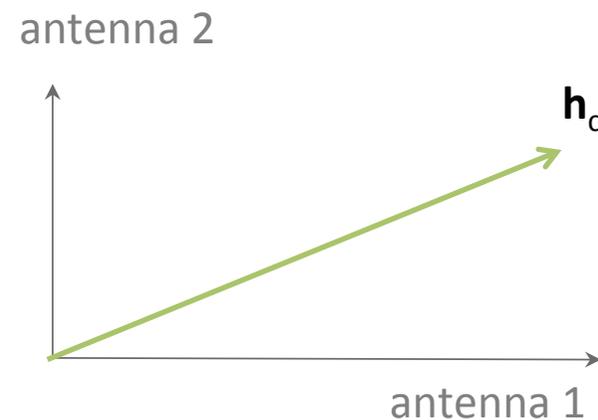
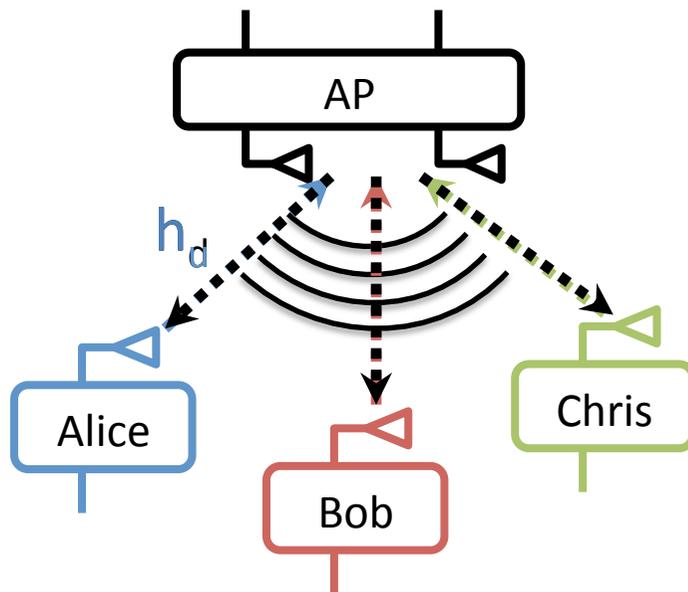


# TurboRate

- Allow clients to adapt their best rates by
  1. reacting to interaction between concurrent clients
  2. learning their rates passively without coordination
    - the original SNR
    - the inter-client angle

# 1. Each Client Learns Its $\text{SNR}_{\text{orig}}$

- Leverage channel reciprocity
  - Forward channel = Reverse channel
- Estimate the uplink channel from AP's beacons
  - Compute the **direction** and amplitude ( $\text{SNR}_{\text{orig}}$ )

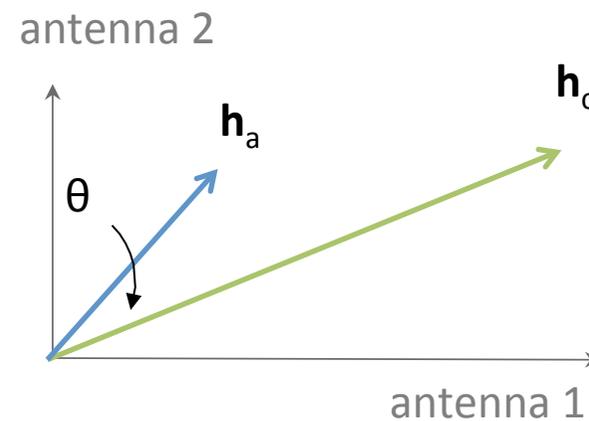
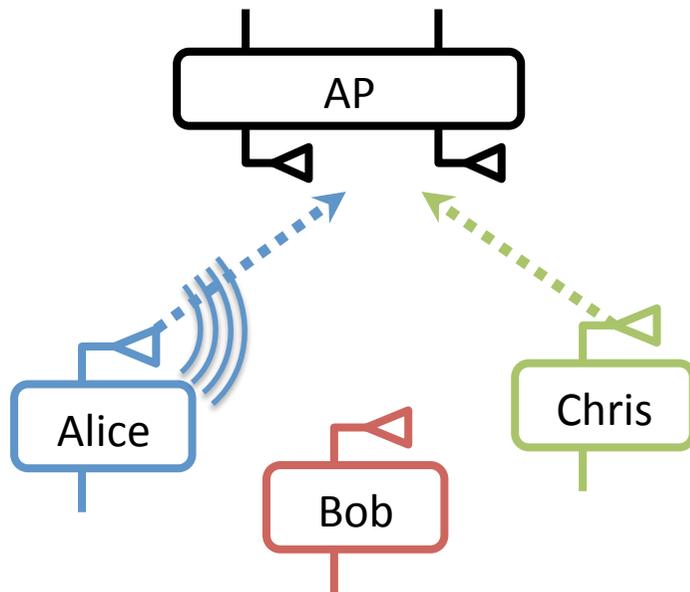


## 2. Learn Inter-Client Angle ( $\theta$ )

Say Chris wants to learn the angle between two signals

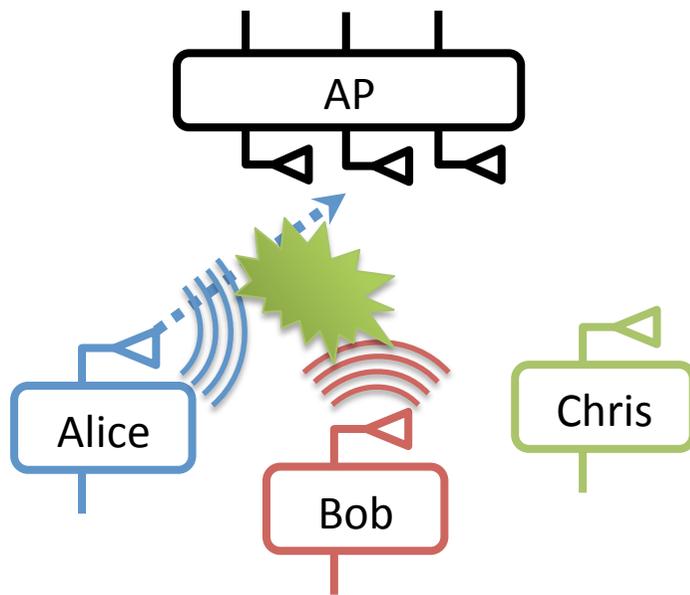
- Learn his own channel
- Learn the direction of ongoing streams

$\text{SNR}_{\text{proj}}$  can be predicted by  $\text{SNR}_{\text{orig}}$  and inter-client angle

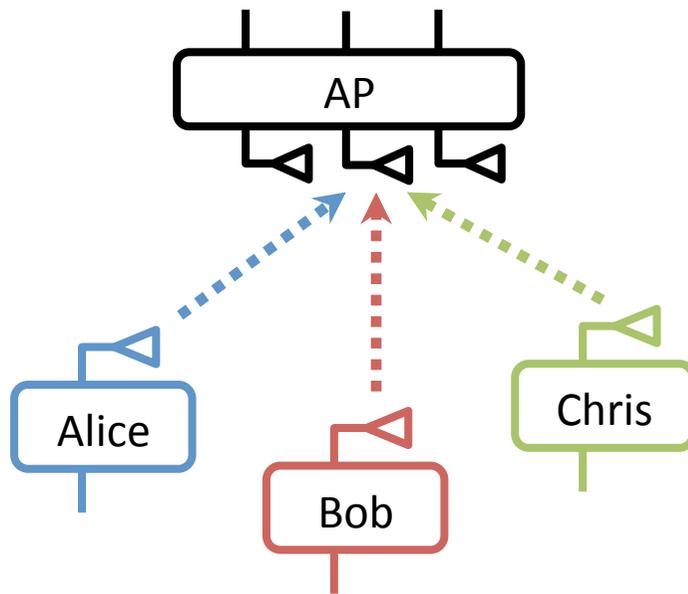
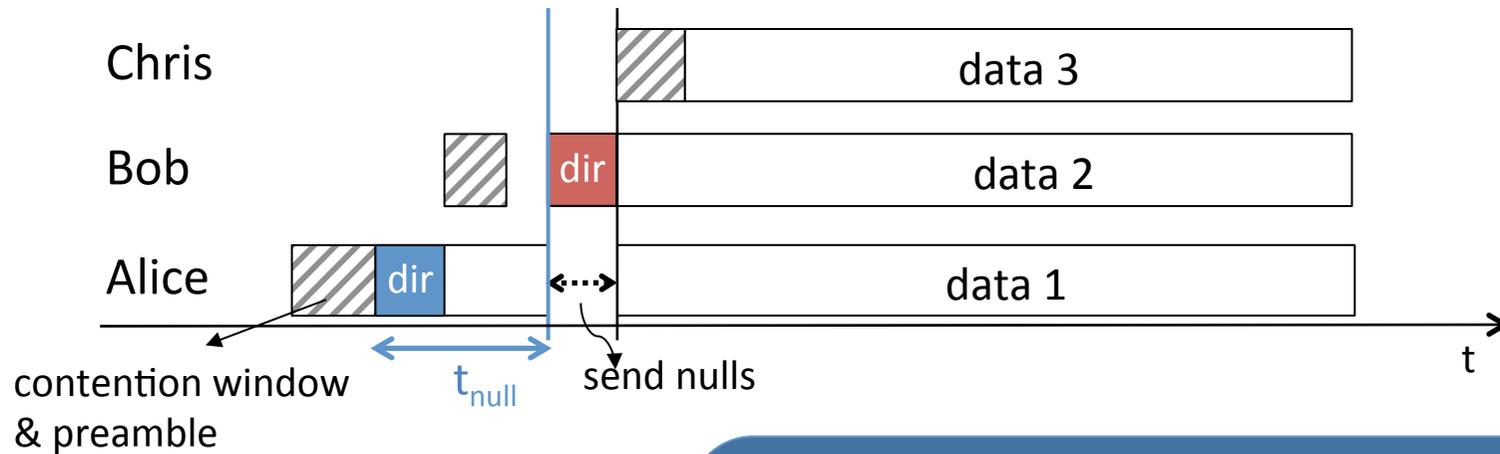


# Doesn't Work for More Than 2 Antennas

- Both Bob and Chris can overhear Alice's direction
- Chris cannot decode Bob in the presence of Alice's signal



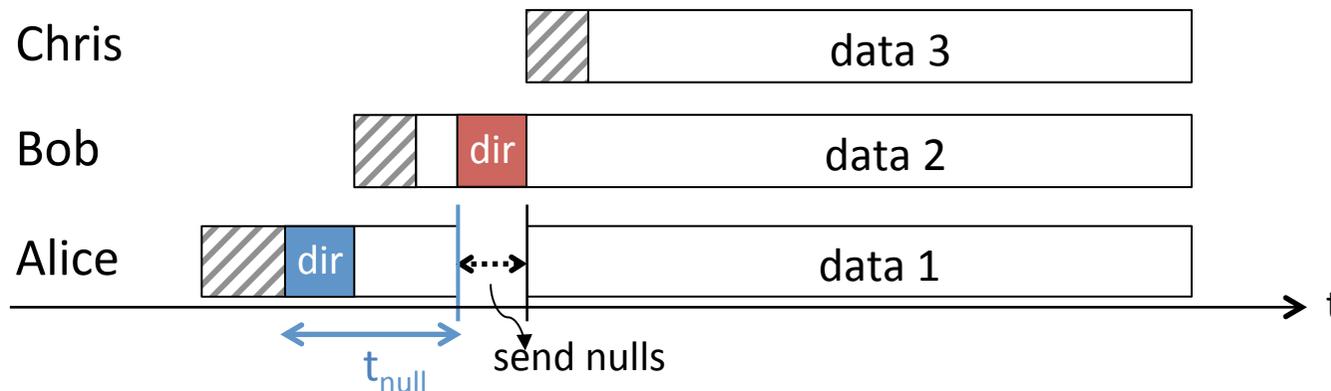
# How to Extend to More Than 2 Antennas



Ongoing transmitters **pause their streams** when later contention winners announce the directions

# TurboRate's MAC

- Alice wins the 1st contention
  - select the rate based on  $\text{SNR}_{\text{orig}}$
  - broadcast her direction and pause transmission at  $t_{\text{null}}$
- Bob wins the 2nd contention
  - select the rate based on  $\text{SNR}_{\text{proj}}$
  - broadcast his direction
- Chris wins the 3rd contention
  - select the rate based on  $\text{SNR}_{\text{proj}}$



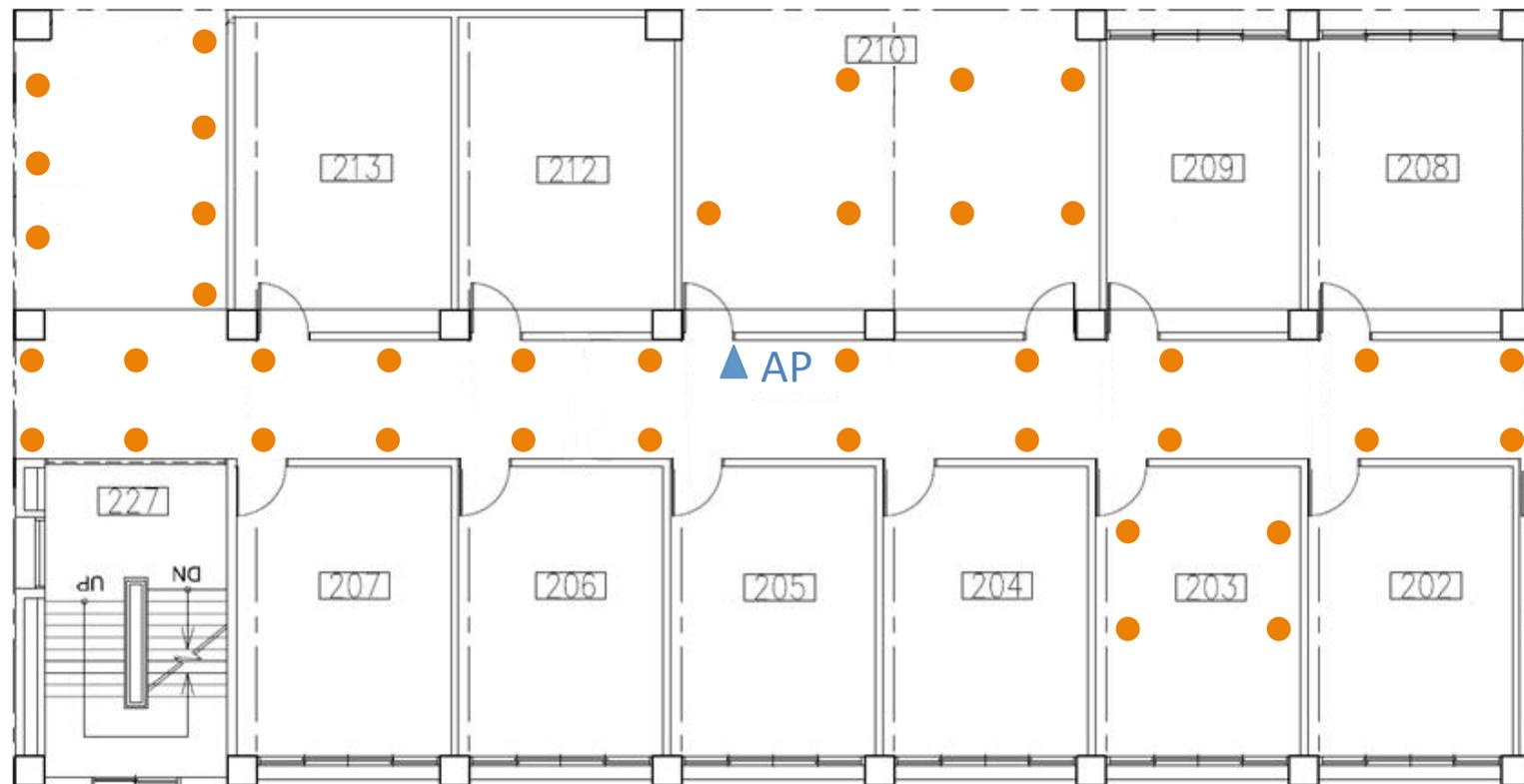
# Performance

# Implementation

- Implemented in USRP-N200
- OFDM with 802.11-style modulations and convolutional codes

# Testbed

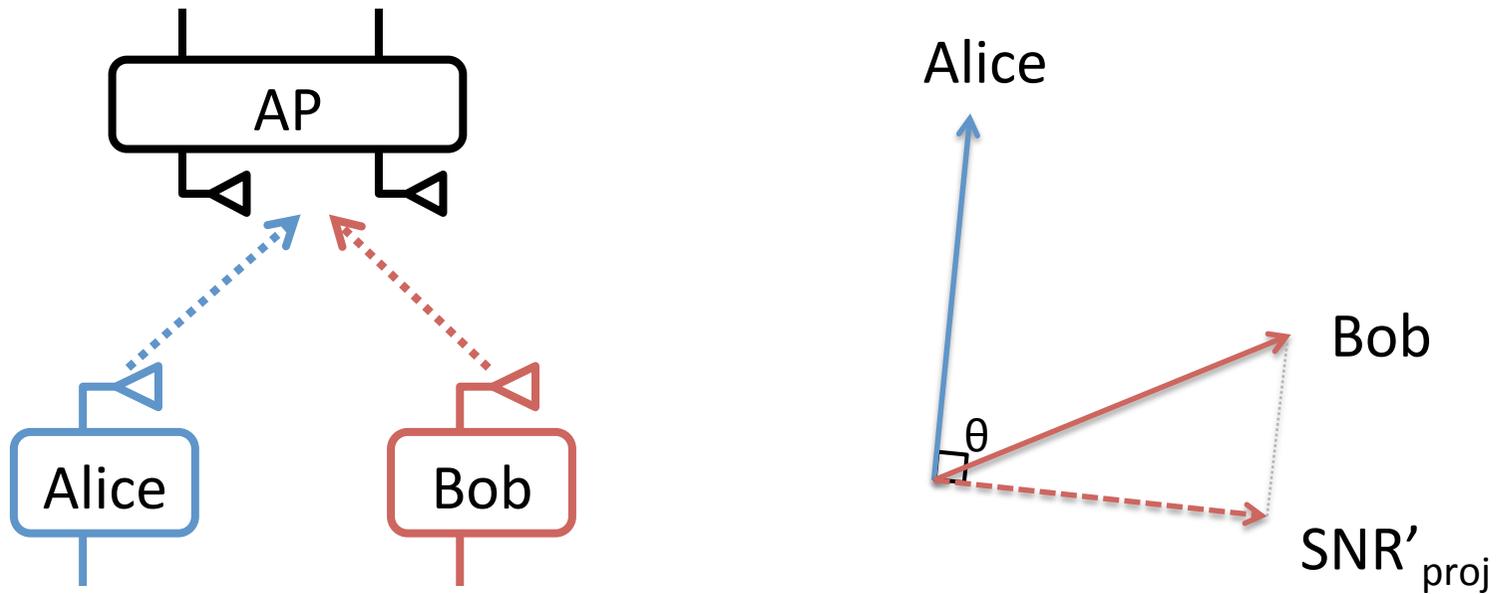
Randomly pick a subset of locations for evaluations



- 1) Is SNR estimation accurate enough?
- 2) What is the gain achieved by **TurboRate**?
- 3) Where does the gain come from?

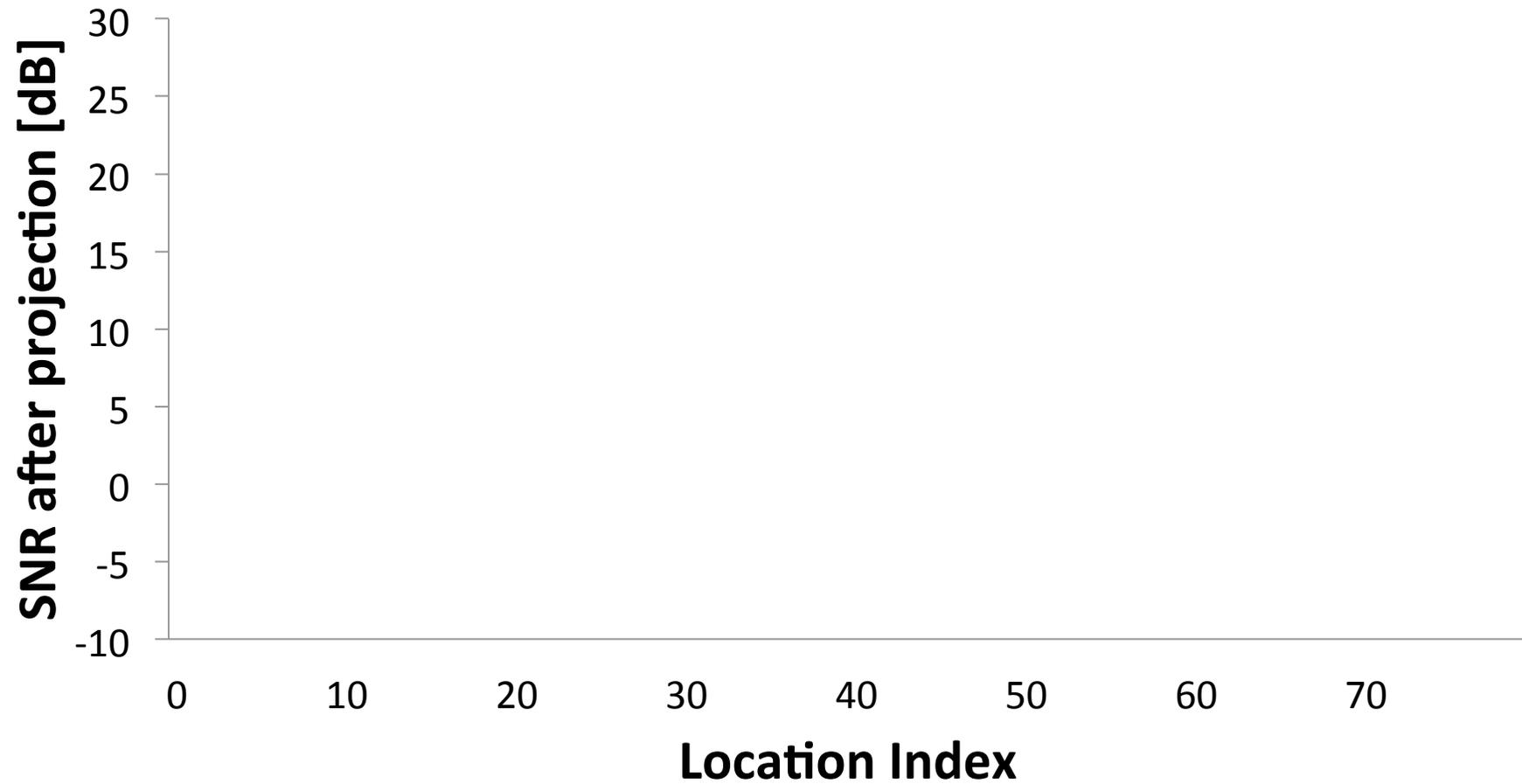
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# Accuracy of SNR Estimation

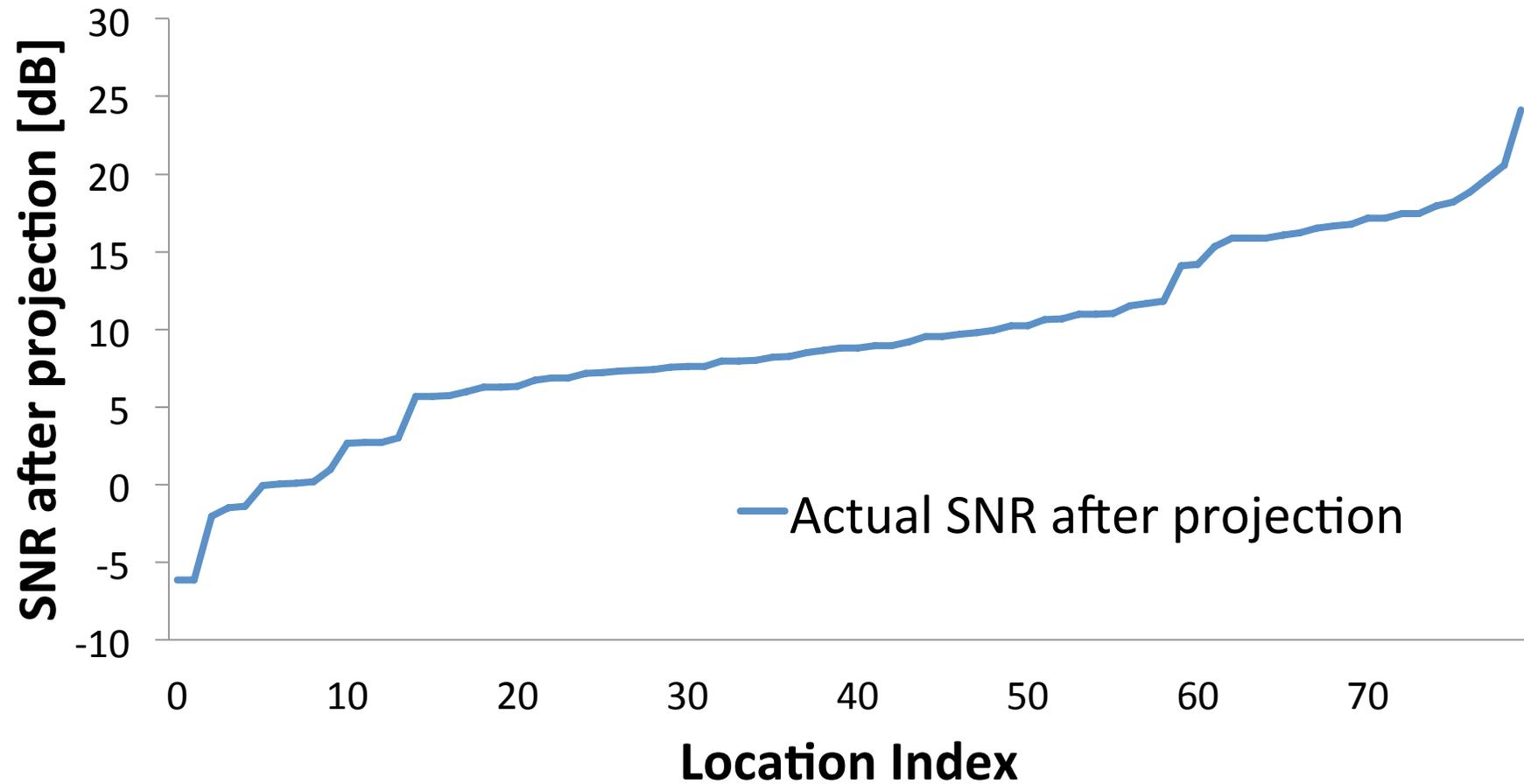


Compare the estimated  $\text{SNR}'_{\text{proj}}$  with the actual  $\text{SNR}_{\text{proj}}$

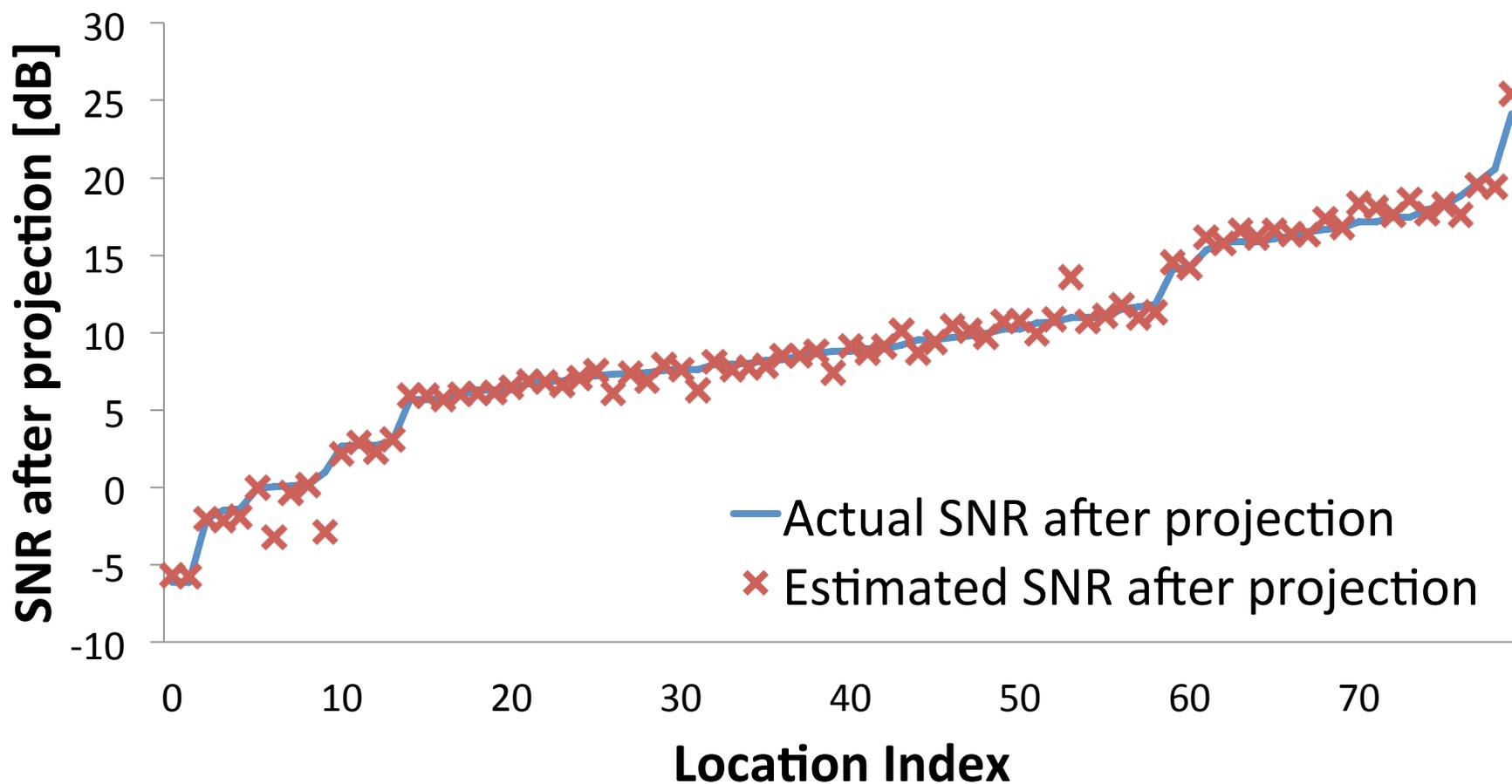
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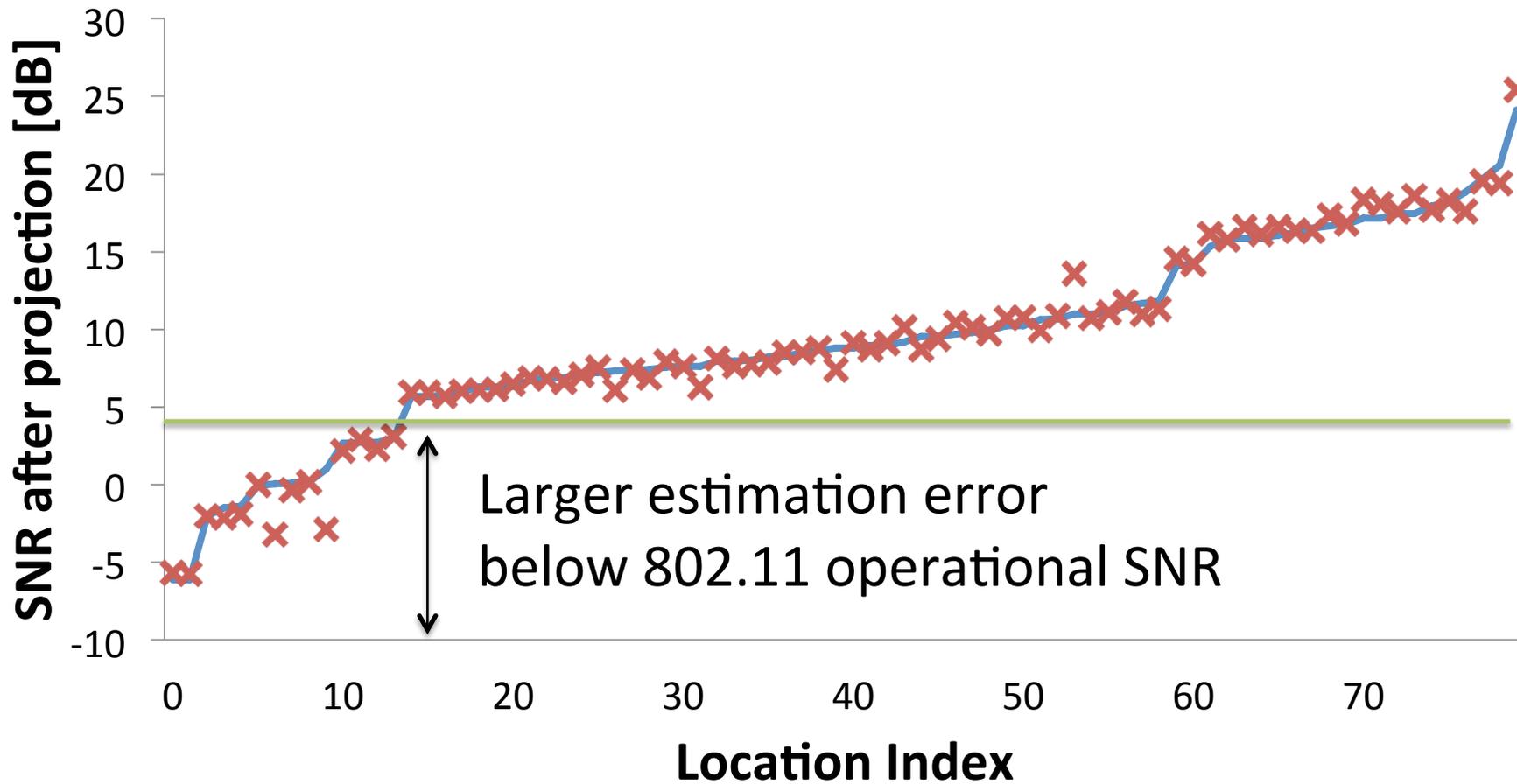
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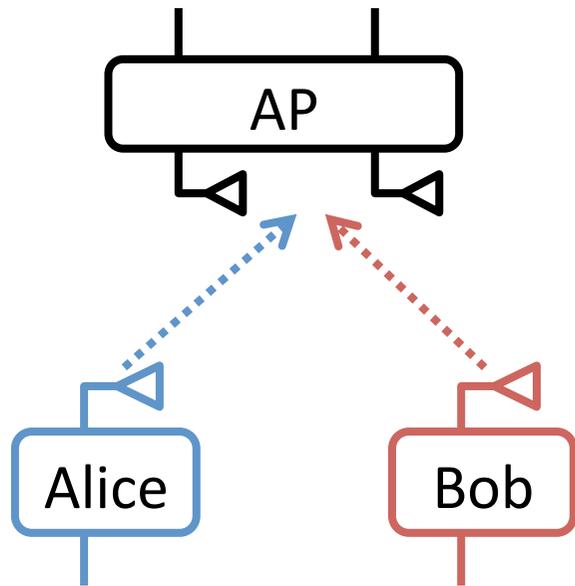


# Accuracy of SNR Estimation



- 1) Is SNR estimation accurate enough?
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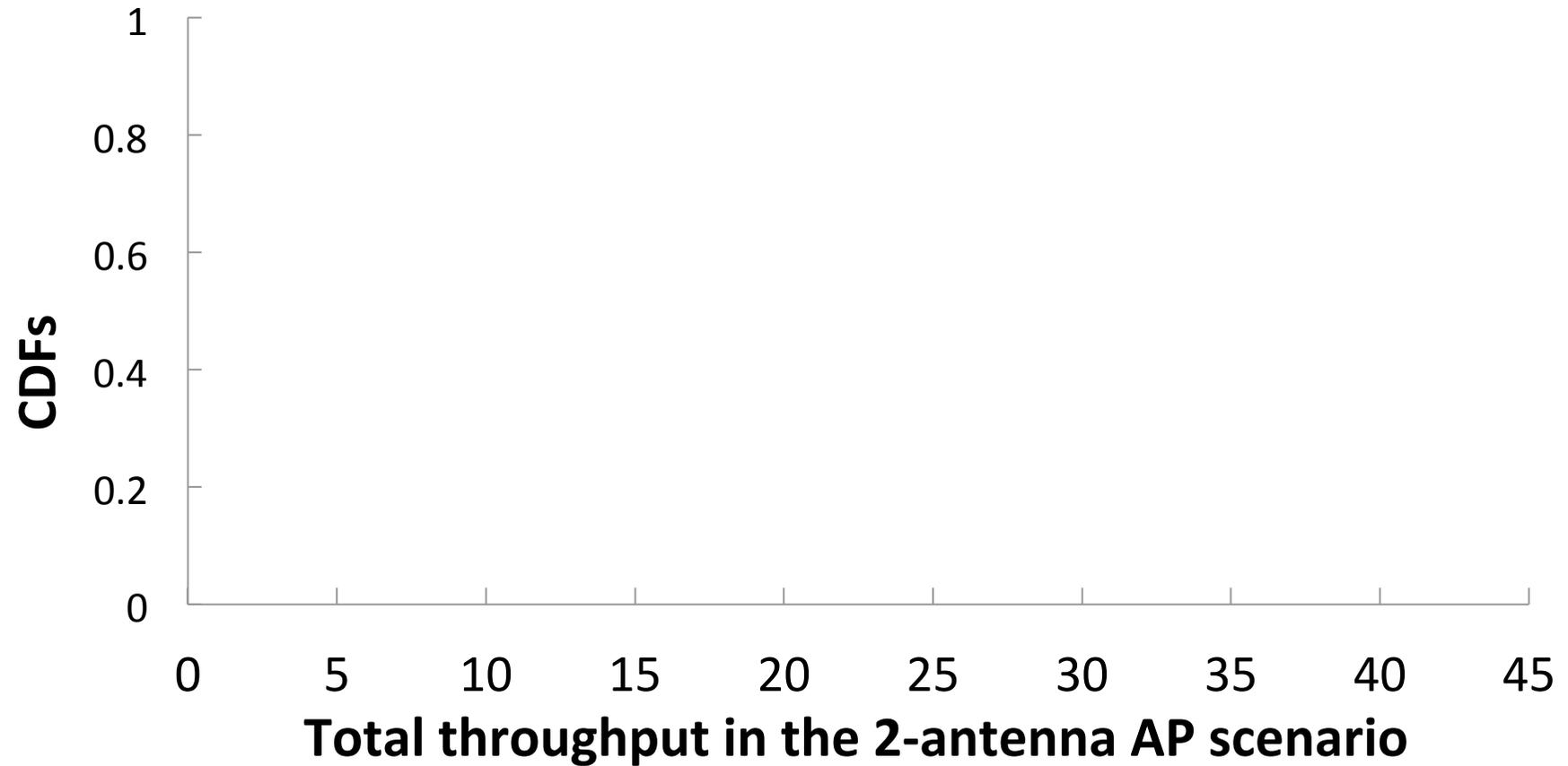
# Throughput Gain for 2-Antenna AP



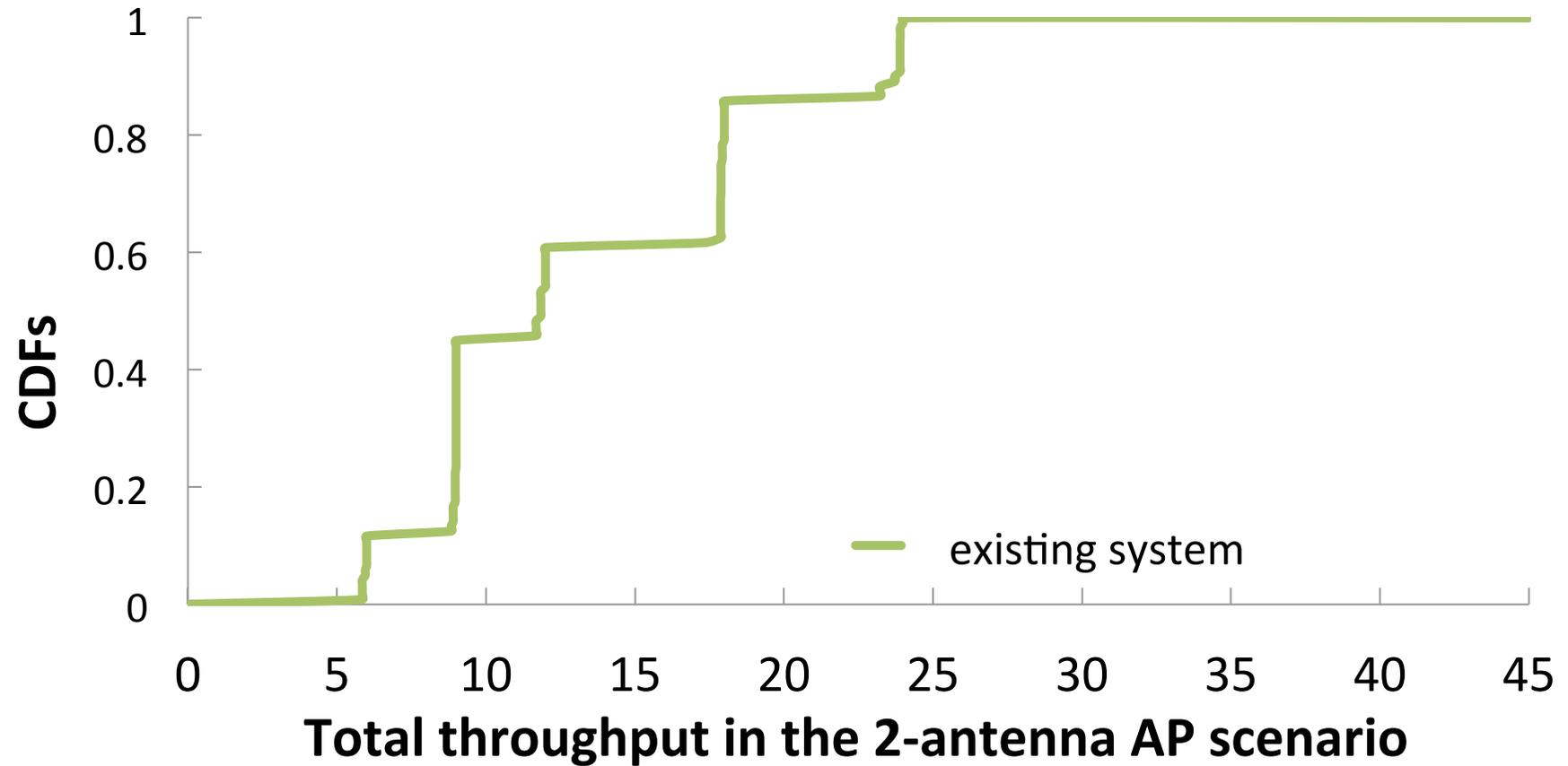
Compare the following schemes

1. Existing 802.11 (single stream)
2. MU-MIMO without TurboRate
3. MU-MIMO with TurboRate

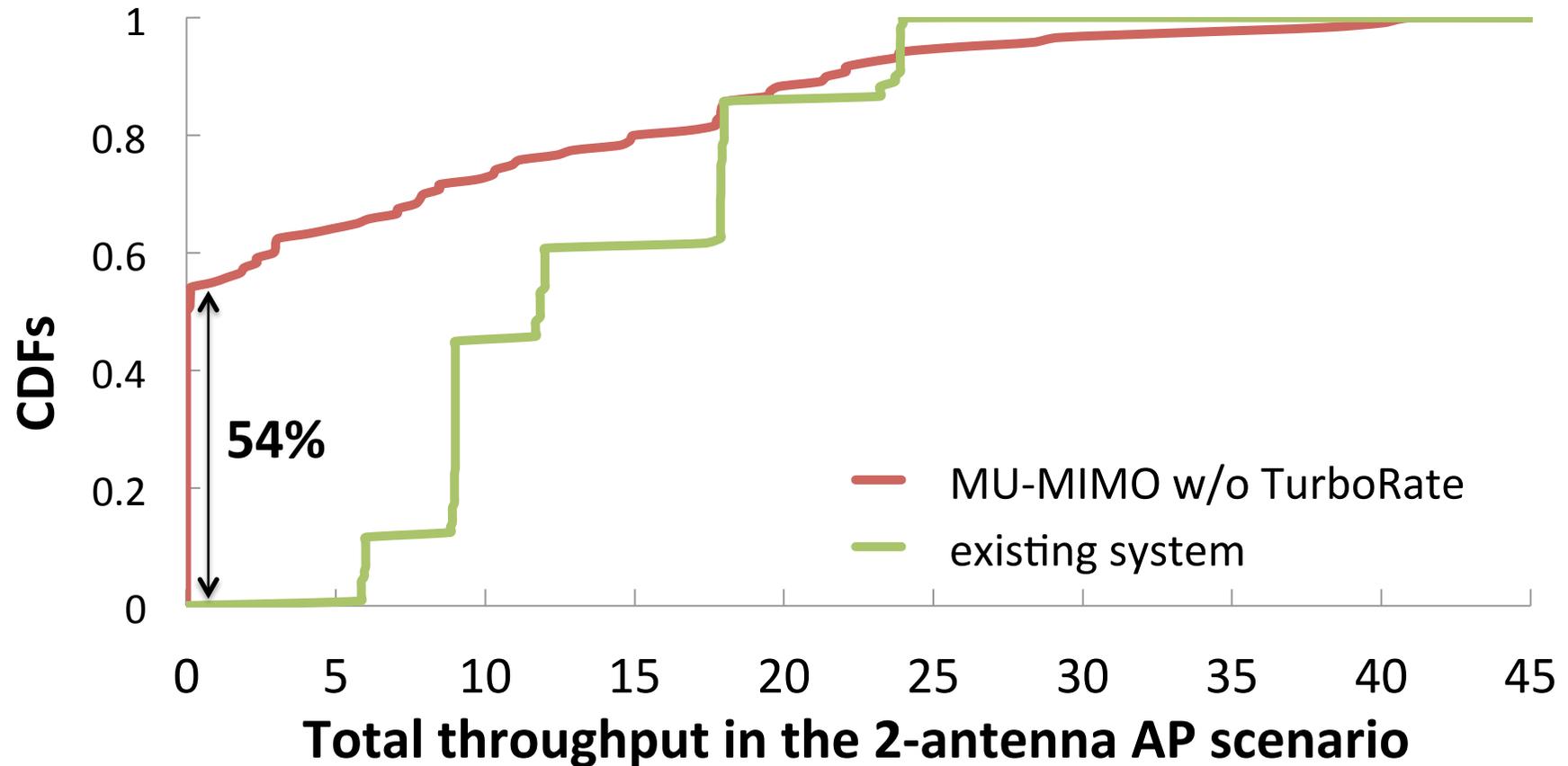
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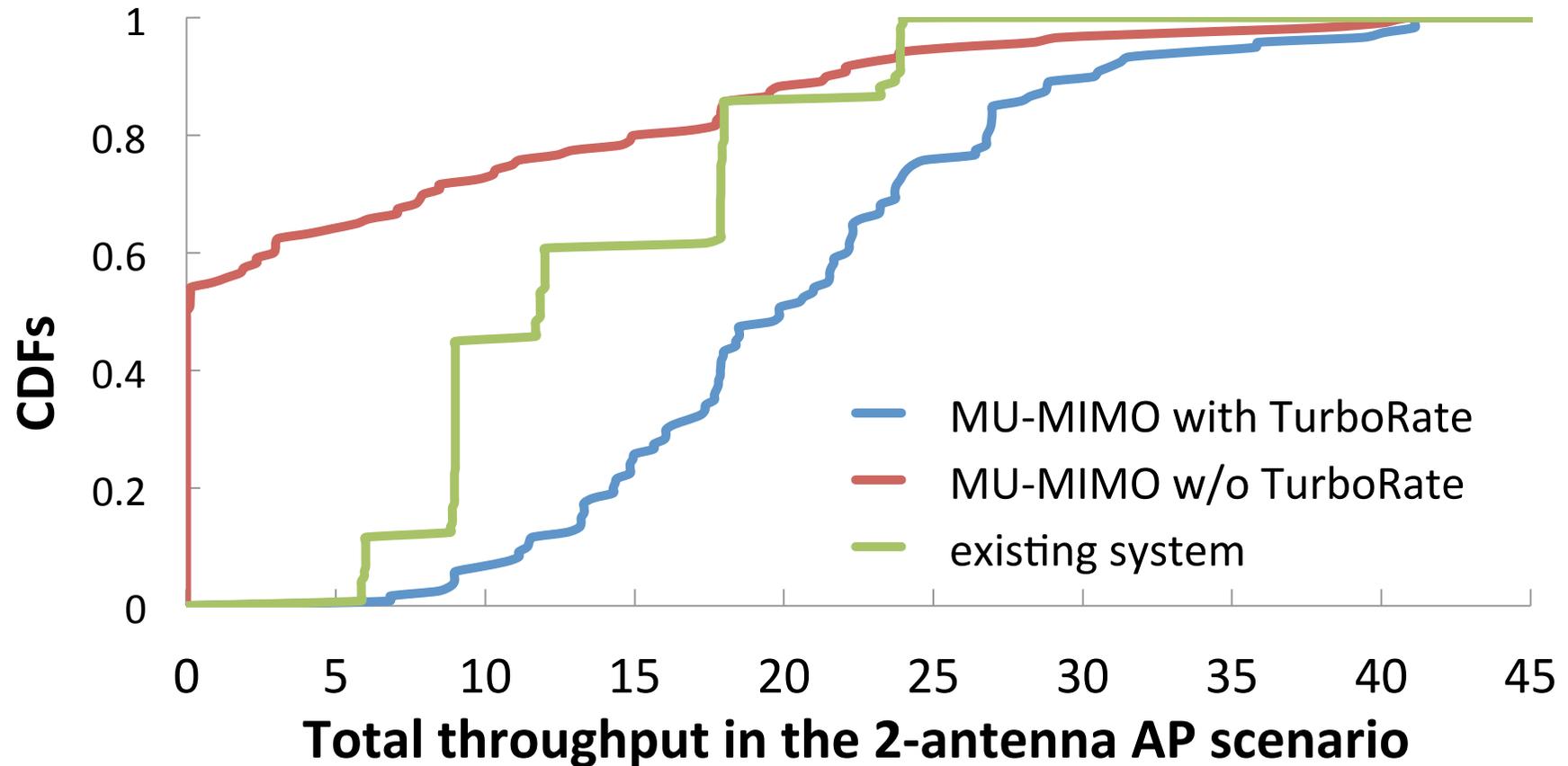


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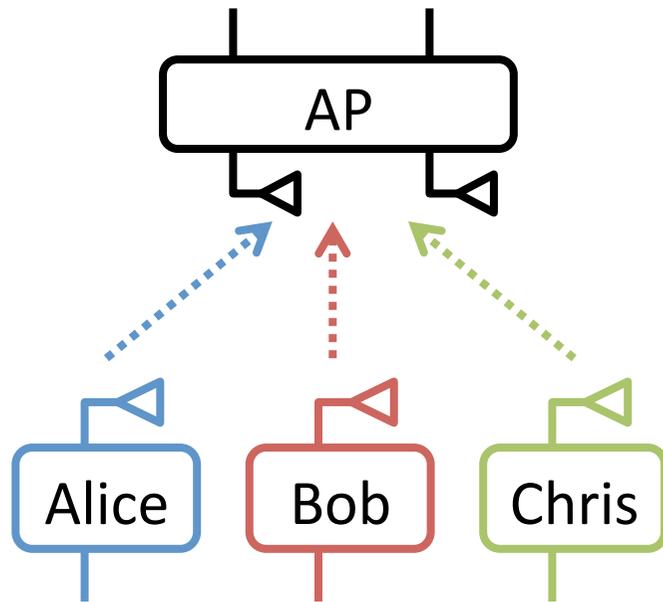
MU-MIMO without rate adaptation  
leads to zero throughput for 54% of cases

# Throughput Gain for 2-Antenna AP



*TurboRate* delivers the MU-MIMO gain  
→ **1.7x** over 802.11

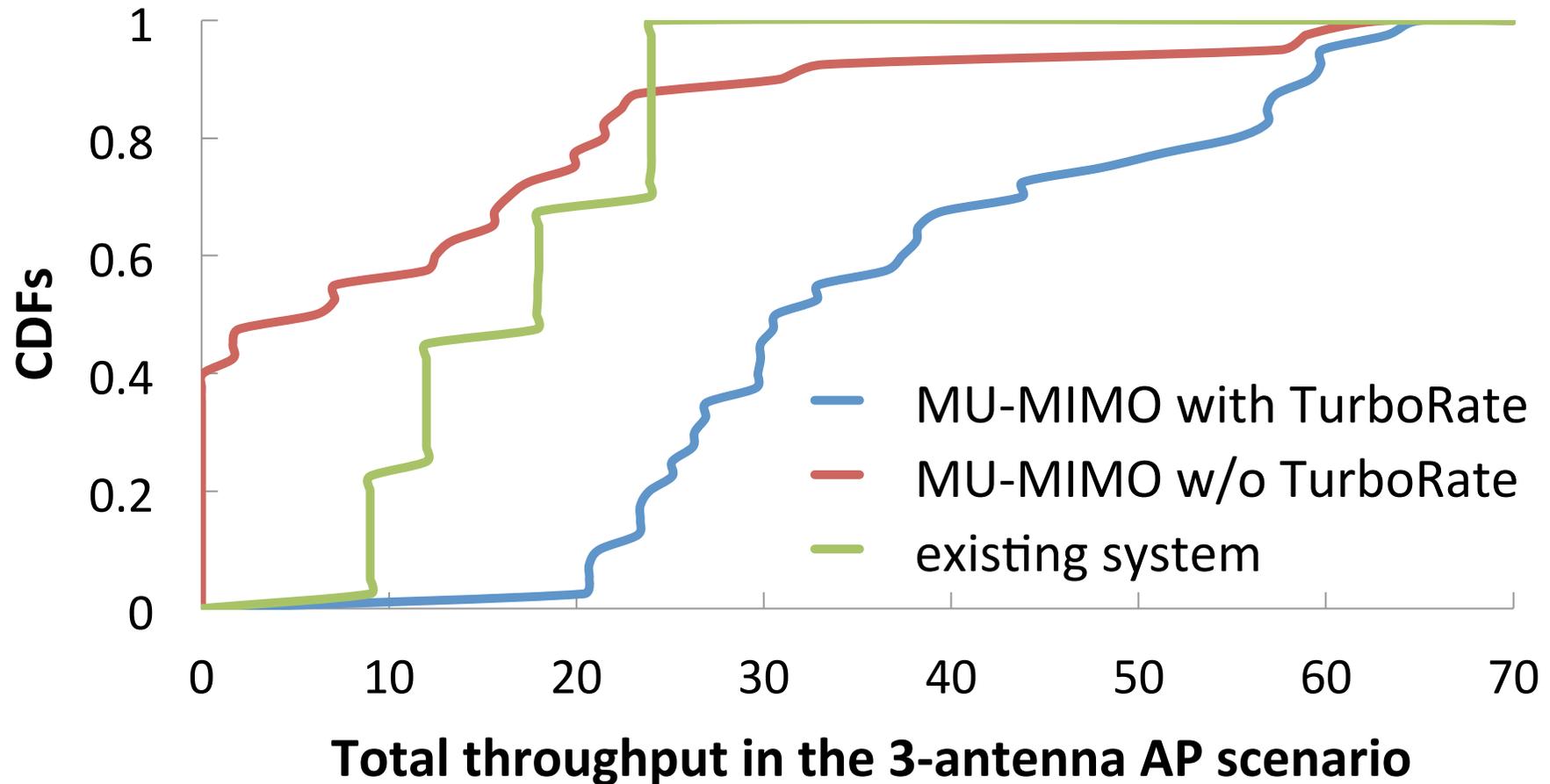
# Throughput Gain for 3-Antenna AP



Compare the following schemes

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2. MU-MIMO with TurboRate
3. MU-MIMO without TurboRate

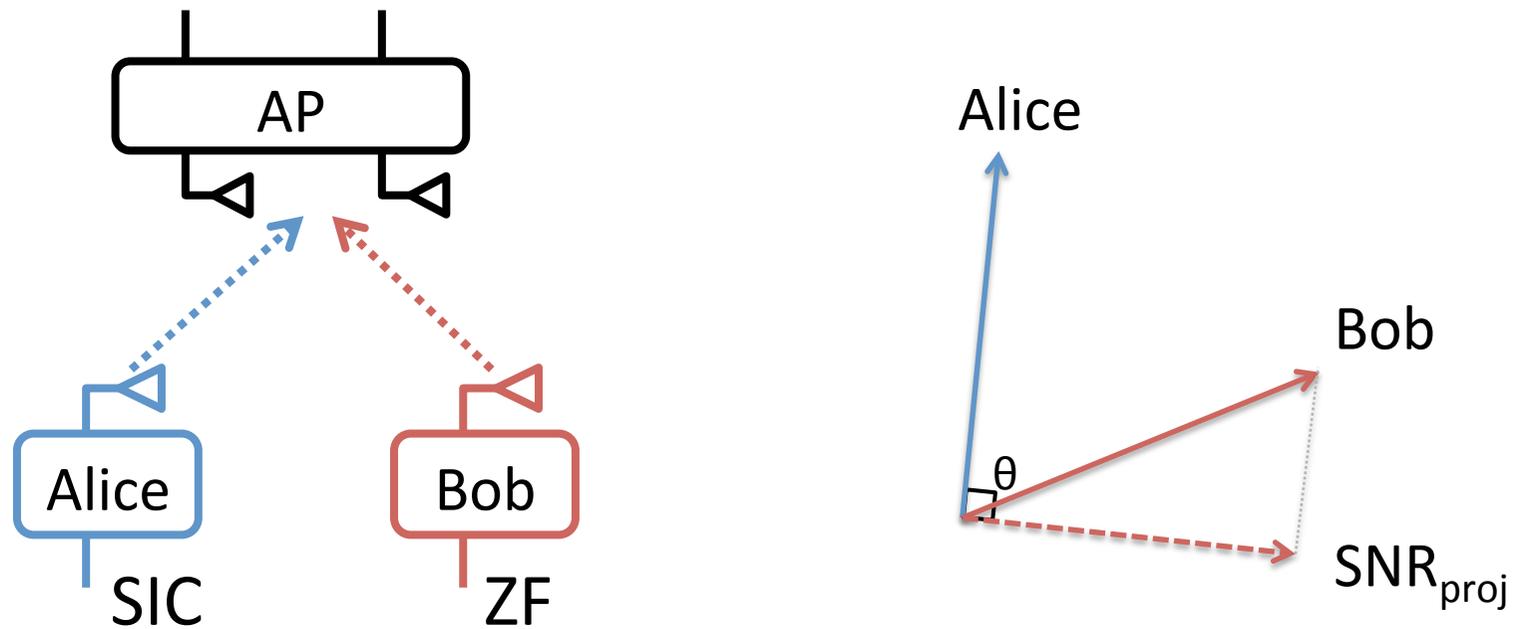
# Throughput Gain for 3-Antenna AP



*TurboRate* improves the throughput  
by **2.3x** over 802.11

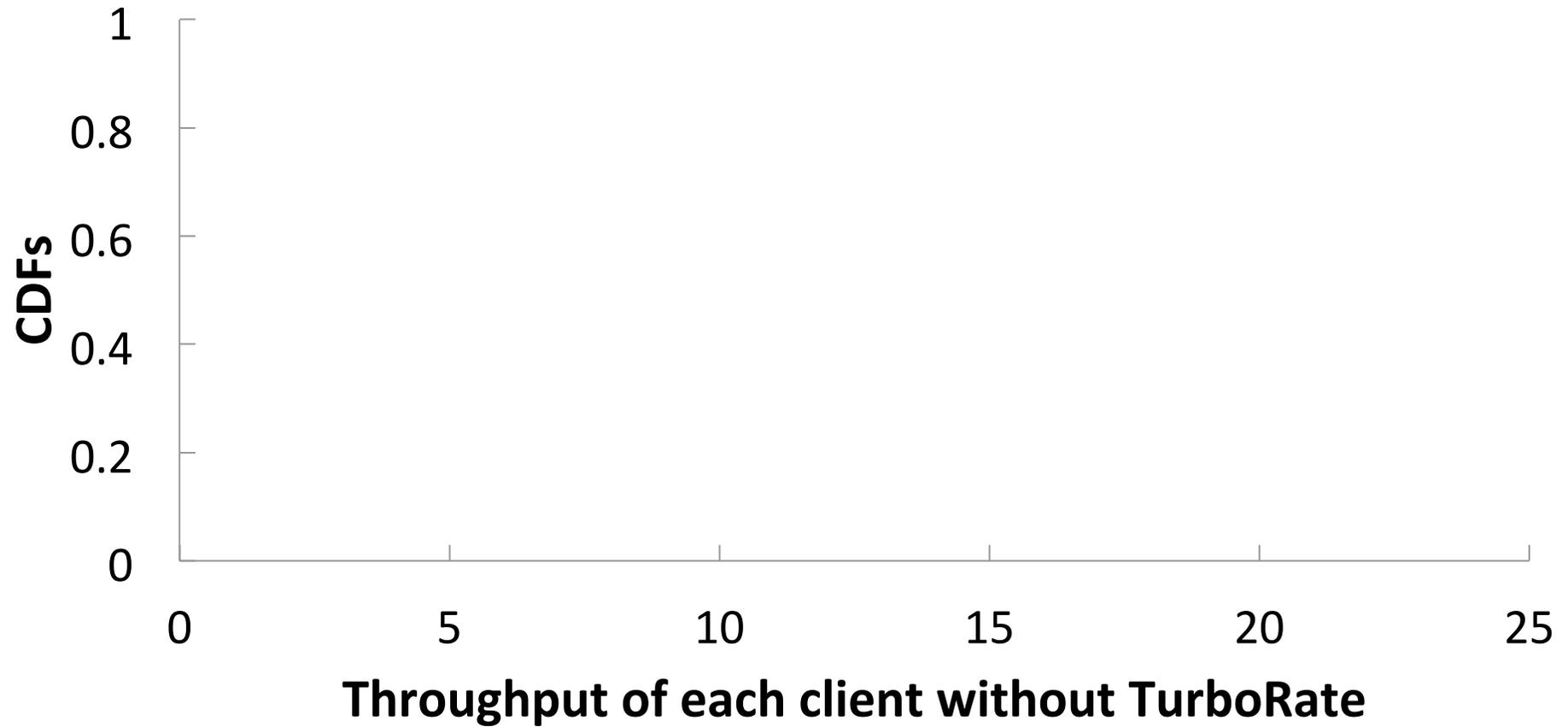
- 1) Is SNR estimation accurate enough?
- 2) What is the gain achieved by *TurboRate*?
- 3) Where does the gain come from?

# Throughput of Individual Clients

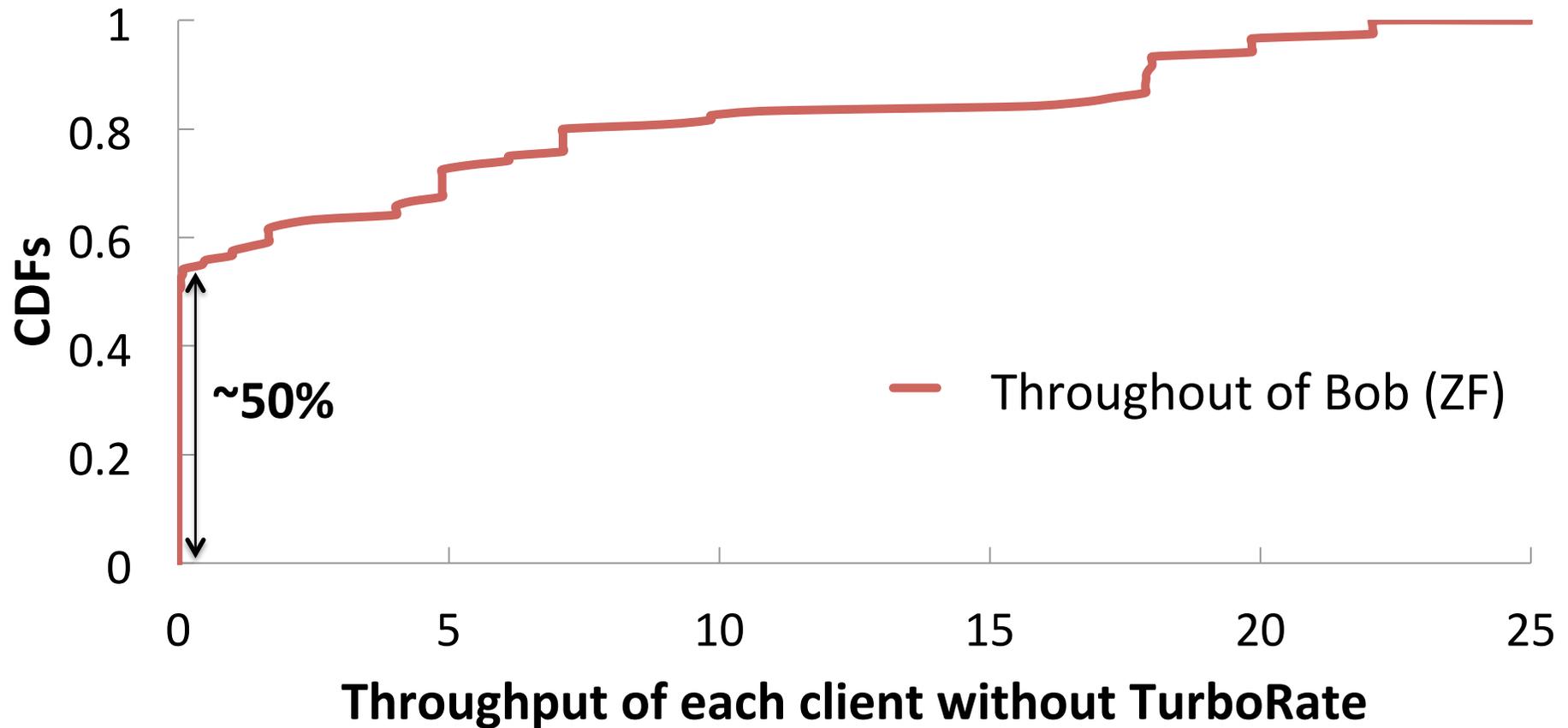


Check the throughput of each client  
w/ and w/o TurboRate

# Throughput w/o TurboRate

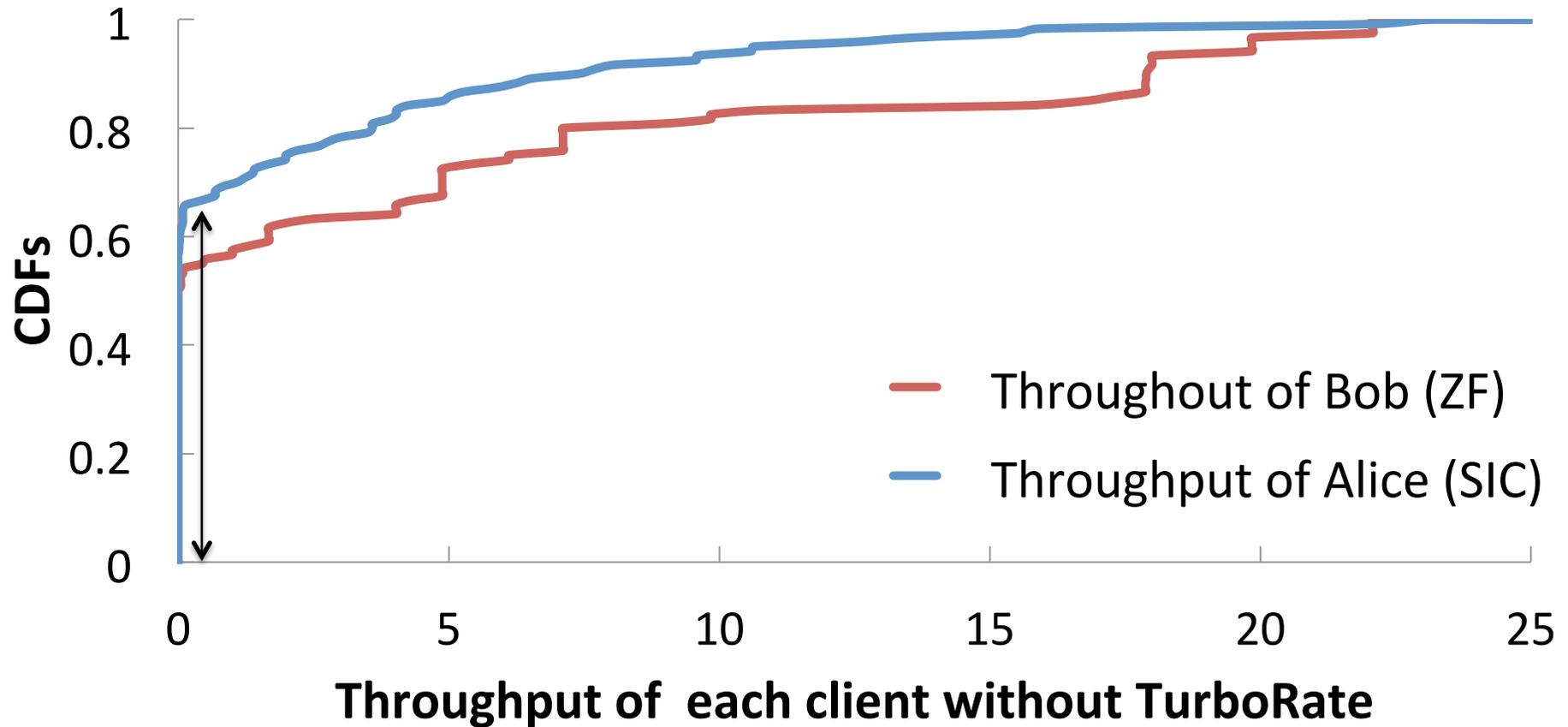


# Bob's Throughput w/o TurboRate



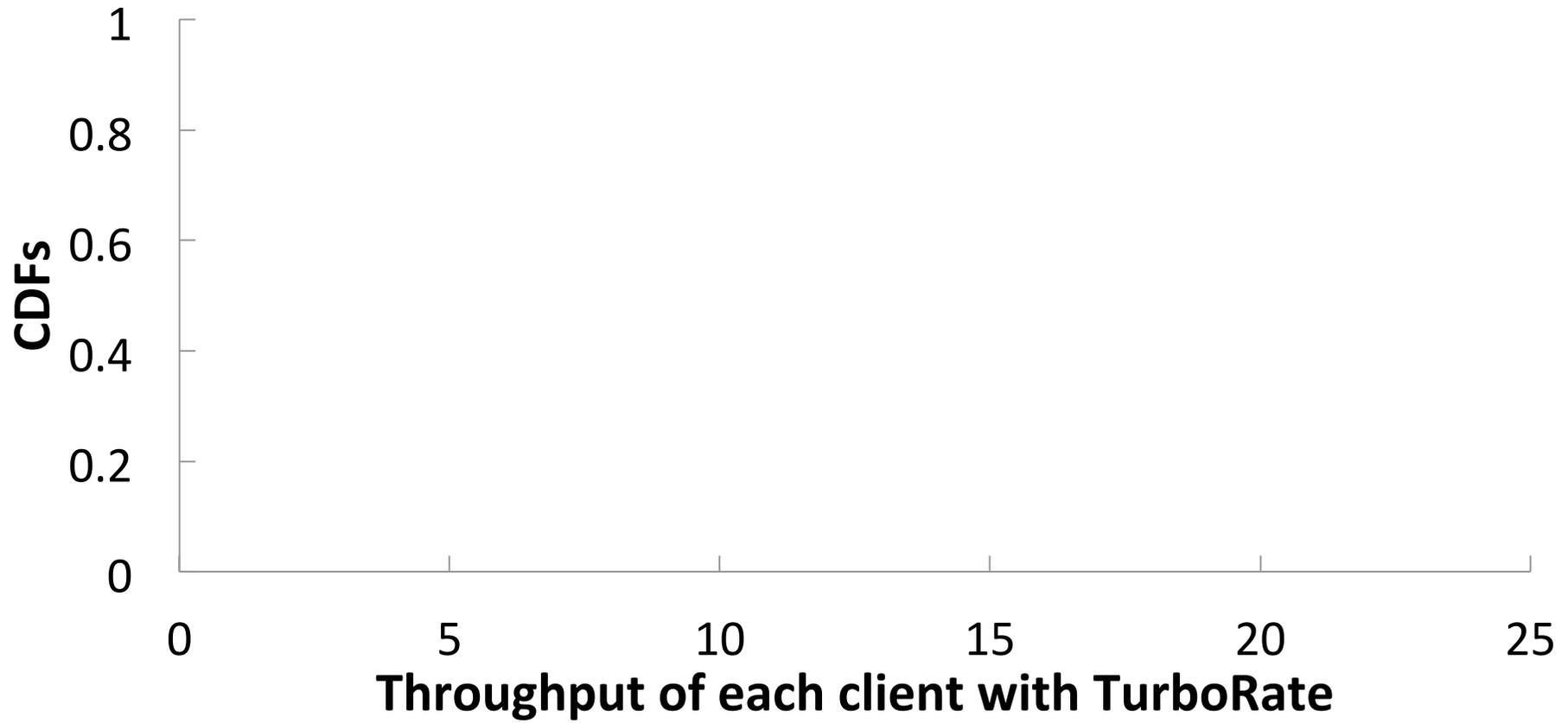
Packets are undecodable if Bob picks a wrong rate

# Alice's Throughput w/o TurboRate

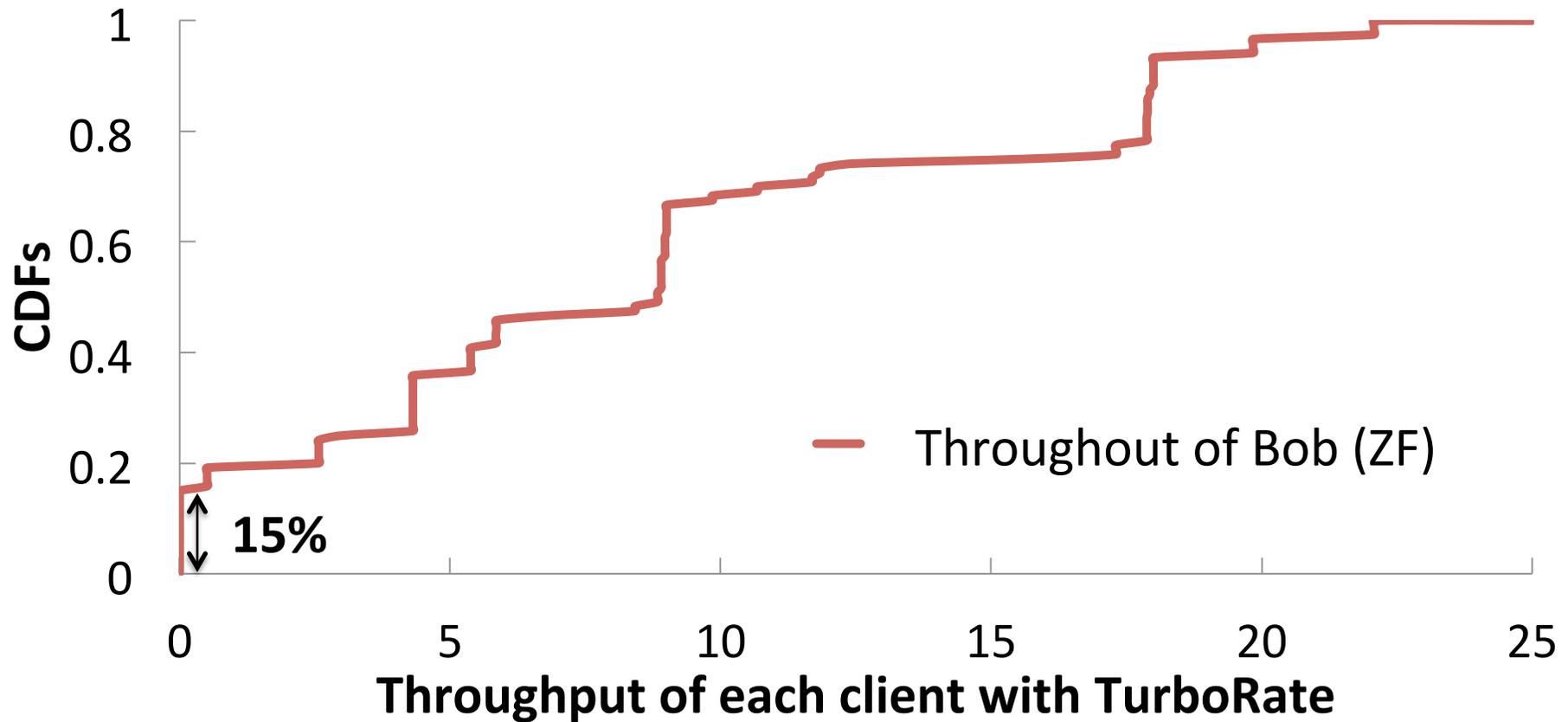


Alice also gets zero throughput

# Throughput w/ TurboRate

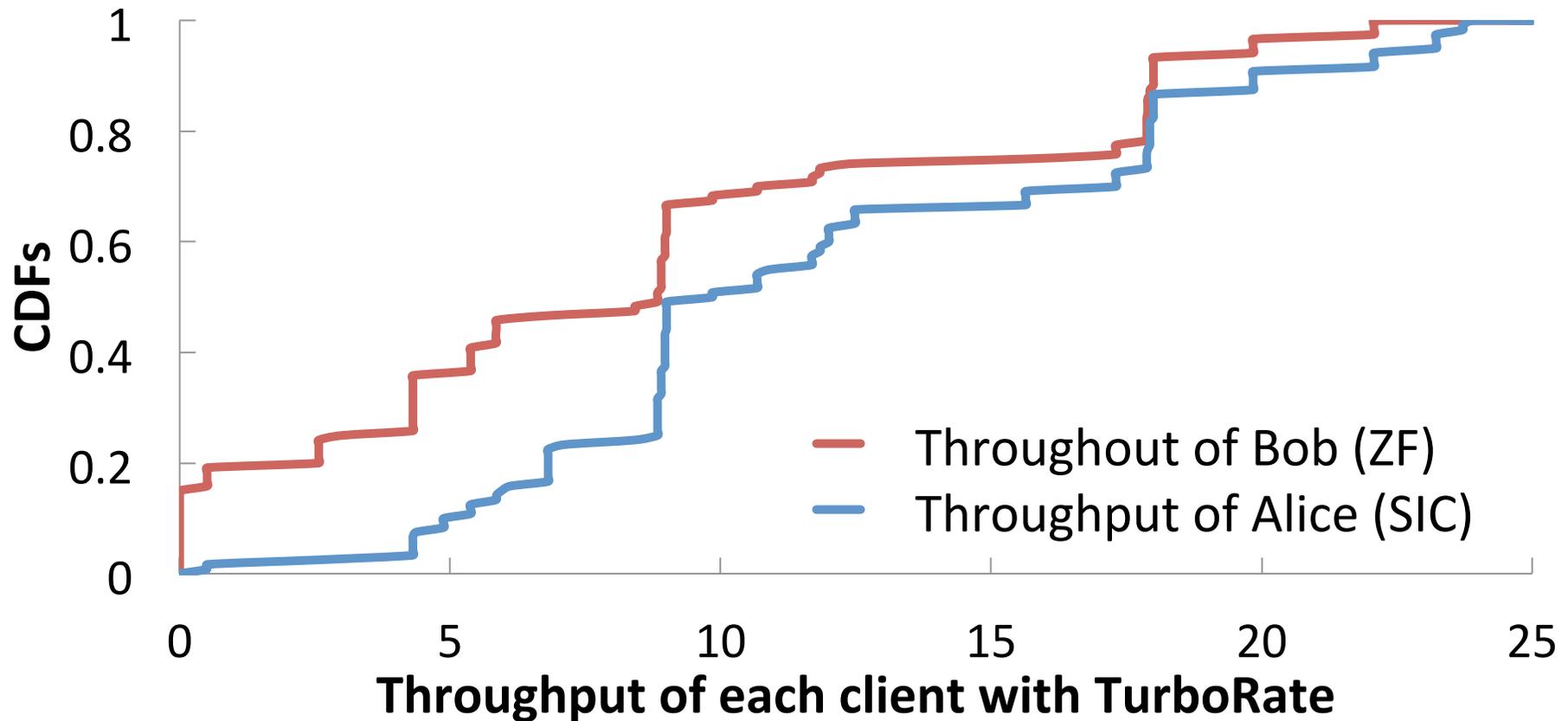


# Bob's Throughput w/ TurboRate



SNR after projection is below 4dB

# Alice's Throughput w/ TurboRate



Alice is not interfered by Bob  
because Bob adapts the rate properly

# Related Works

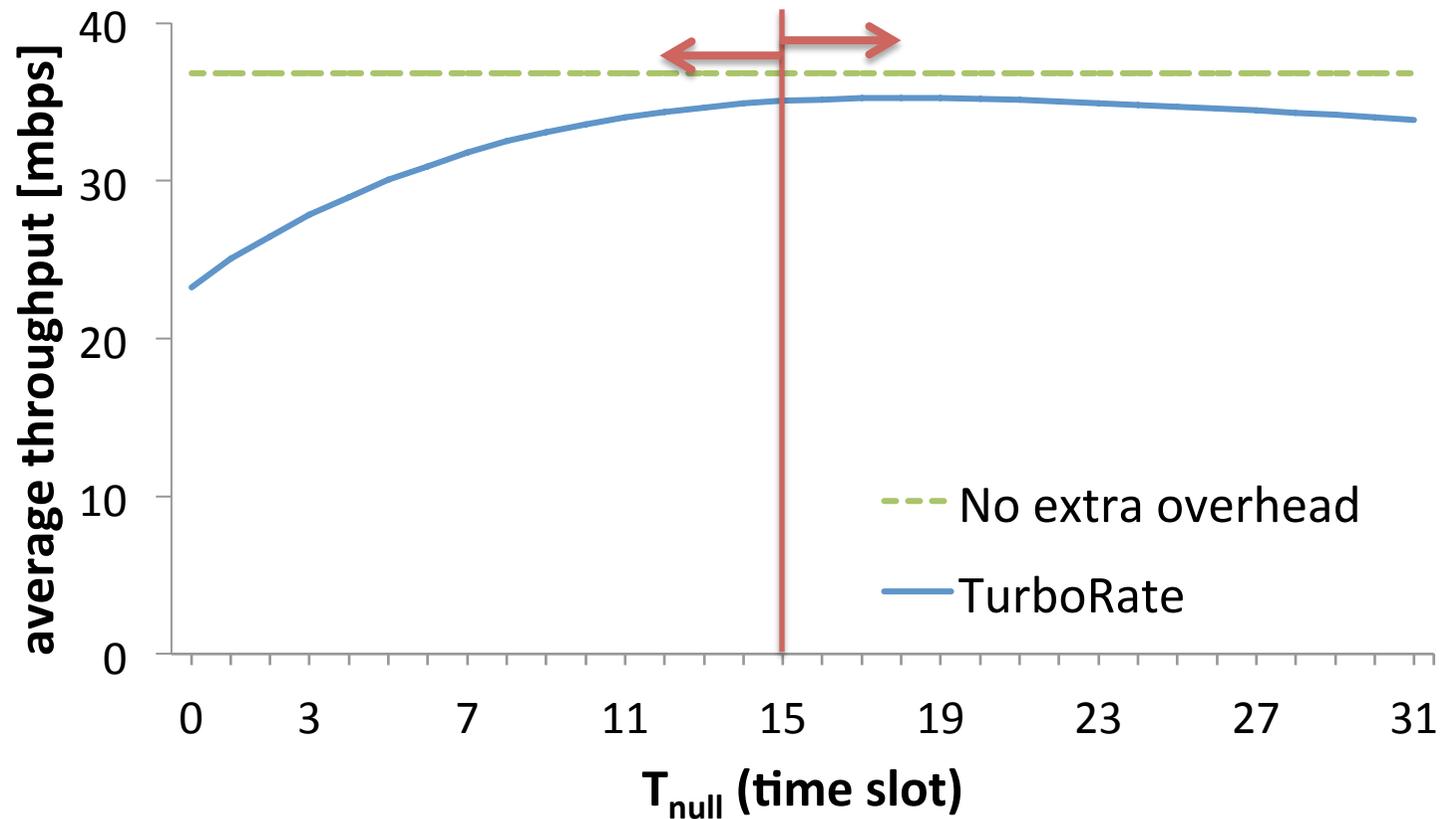
- MU-MIMO Systems
  - SAM[TLFWZC09], IAC[GPK09], 802.11n+[LGK11], ...
- Bit Rate Adaptation
  - [LCK], [ZJLMB08], [KCK07], ...

First rate adaptation protocol for  
uplink MU-MIMO networks

# Conclusion

- Distributed rate adaption protocol for MU-MIMO LANs
- Clients can select bit rate by passively learning
  - Its own SNR
  - The direction of ongoing transmitters
- Shown practical via implementation and testbed evaluation

# Overhead for 3-antenna Scenario



small  $t_{\text{null}}$  : decrease concurrent transmission opportunities