# Hybrid Scheduling in Heterogeneous Half- and Full-Duplex Wireless Networks

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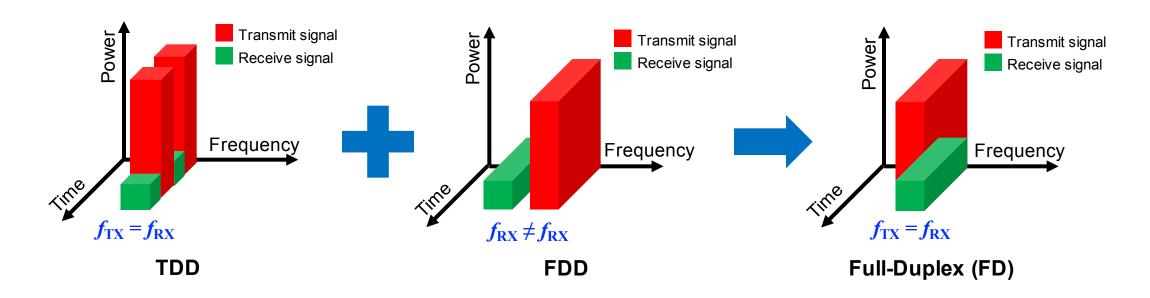
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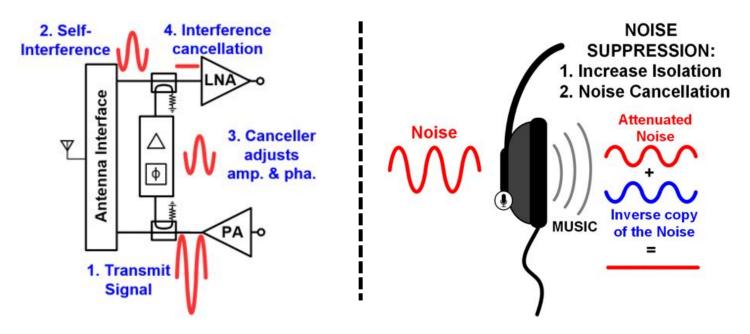
#### Full-Duplex Wireless

- Legacy half-duplex wireless systems separate transmission and reception in either:
  - Time: Time Division Duplex (TDD)
  - Frequency: Frequency Division Duplex (FDD)
- (Same channel) Full-duplex communication: simultaneous transmission and reception on the same frequency channel



#### Full-Duplex Wireless

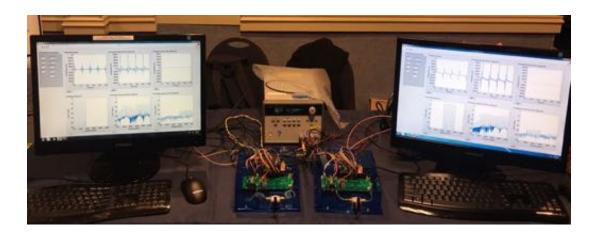
- Benefits of full-duplex wireless:
  - Increased system throughput and reduced latency
  - More flexible use of the wireless spectrum and energy efficiency
- Viability is limited by self-interference
  - Transmitted signal is **billions** of times  $(10^9 \text{ or } 90 \text{ dB})$  stronger than the received signal
  - Requiring extremely powerful self-interference cancellation

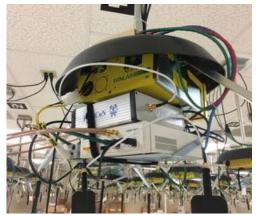


## The Columbia FlexICoN Project



- <u>Full-Duplex</u> Wireless: From <u>Integrated</u> <u>Circuits to <u>Networks</u> (FlexICoN)
  </u>
  - Development of full-duplex transceiver/system, algorithm design, experimental evaluation, etc.
  - Integration of full-duplex capability with the open-access ORBIT testbed









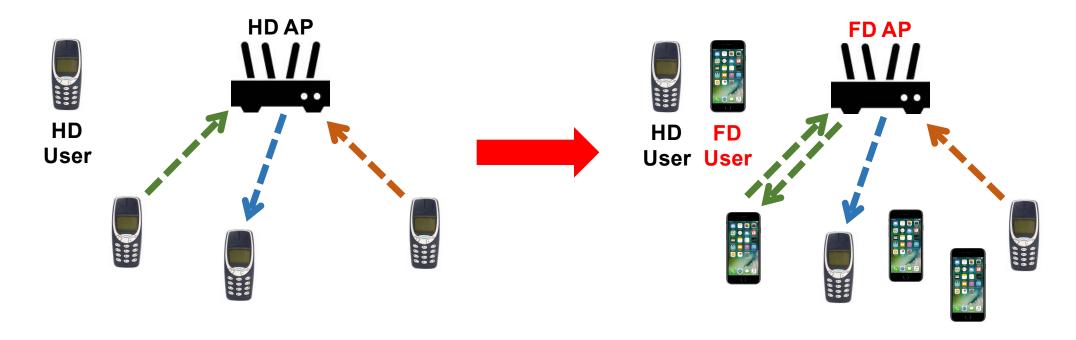
Gen-2 wideband full-duplex link (Demo at INFOCOM'17)

A programmable Gen-1 full-duplex node installed in ORBIT (Demo Session 2 on Wed. at 9:30am in Palace Lounge)

- Future integration with the *PAWR COSMOS* city-scale testbed (NSF PAWR Session on Wed. at 15:30pm in Tapa 1)

#### **Motivation**

• Gradual replacement and introduction of full-duplex (FD) devices into legacy half-duplex (HD) networks



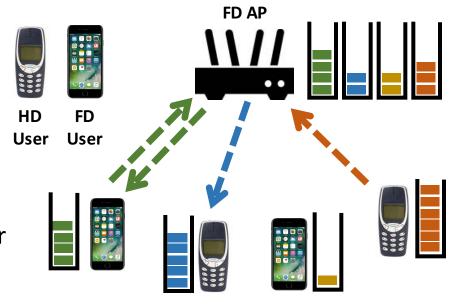
Goal: Develop efficient and fair scheduling algorithms in such heterogeneous half-duplex and full-duplex networks with performance guarantees

#### Related Work

- Full-duplex radio/system design
  - Laboratory bench-top design: [Choi et al. 2010], [Duarte & Sabharwal, 2010], [Aryafar et al. 2012], [Bharadia et al. 2013/2014], [Kim et al. 2013/2015], [Korpi et al. 2016], [Sayed et al. 2017]
  - Integrated circuits (small form-factor) design: [Zhou et al. 2014/2015], [Debaillie et al. 2015], [Yang et al. 2015], [Reiskarimian et al. 2016/2017], [Zhang et. al 2017/2018]
- Throughput gains from full-duplex:
  - [Xie & Zhang, 2014], [Nguyen et al. 2014], [Korpi et al. 2015], [Marasevic et al. 2017/2018]
- Cellular/WiFi scheduling:
  - [Duarte et al. 2014], [Yang & Shroff, 2015], [Alim et al. 2016], [Chen et al. 2015/2016], [Goyal et al. 2016/2017]
- CSMA/Scheduling in legacy half-duplex networks:
  - CSMA, Max-Weight, Greedy-Maximal, Longest-Queue-First, Q-CSMA, etc. [Kleinrock & Tobagi, 1975], [Tassiulas & Ephremides 1992], [Dimakis & Walrand, 2006], [Brzezinski et al. 2006], [Ni et al. 2012], [Birand et al. 2012], etc.
- Heterogeneous networks with both half- and full-duplex users were not considered
- Fairness between half- and full-duplex users was not considered
- Very little work provided performance guarantees (e.g., throughput optimality)

#### Model

- Time is slotted (t = 1, 2, ...)
- A single-channel, collocated, heterogeneous network with one access point (AP) and N users:
  - The AP and  $N_F$  users are full-duplex (FD)
  - $N_H = N N_F$  users are half-duplex (HD)
- ullet N downlink queues at the AP and one uplink queue at each user
  - The AP has information about *all downlink queues*
  - A user has information about *only its uplink queue*
- Unit link capacity and perfect self-interference cancellation



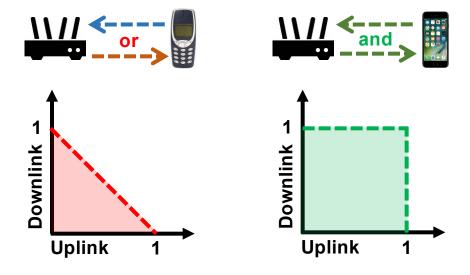
A heterogeneous network with  $N_F = N_H = 2$ 

- Feasible schedules: a single half-duplex uplink or downlink, or a pair of full-duplex uplink and downlink
- A pair of full-duplex uplink and downlink are always scheduled at the same time

#### Problem Formulation

- Capacity Region: Convex hull of all feasible schedules
- For a legacy half-duplex user:  $\lambda_{\rm uplink} + \lambda_{\rm downlink} \leq 1$
- For a full-duplex user:

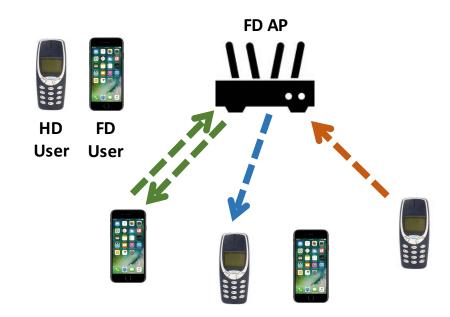
$$\lambda_{\text{uplink}} \leq 1$$
 $\lambda_{\text{downlink}} \leq 1$ 
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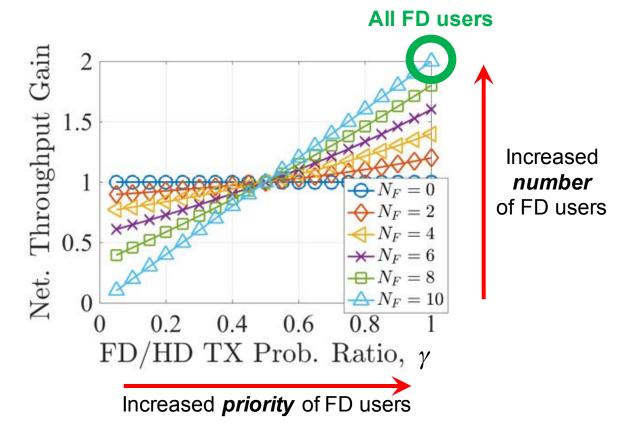
- A scheduling algorithm is *throughput-optimal* if it can keep the network queues stable for all arrival rate vectors in the interior of the capacity region
- <u>Goal</u>: Achieve maximum throughput in networks with <u>heterogeneous</u> half-duplex and full-duplex users in a distributed manner, while being <u>fair</u> to all the users and having favorable delay performance
- <u>Solution</u>: H-GMS A <u>H</u>ybrid scheduling algorithm that combines centralized <u>G</u>reedy <u>M</u>aximal <u>S</u>cheduling (GMS) and distributed Q-CSMA

# Introducing Full-Duplex Users – Everyone Gains!

- A *homogeneous* network with N=10 half-duplex users **vs.** A *heterogeneous* network with  $N_H$  half-duplex users and  $N_F$  full-duplex users ( $N_H + N_F = N = 10$ )
- Consider the a static CSMA algorithm with fixed transmission probabilities  $p_H$  and  $p_F$  for half-duplex and full-duplex users. Let  $p_F = \gamma p_H$  with  $\gamma \in (0, 1]$
- With  $p_H = 0.5$ , throughput gain of the *network*:

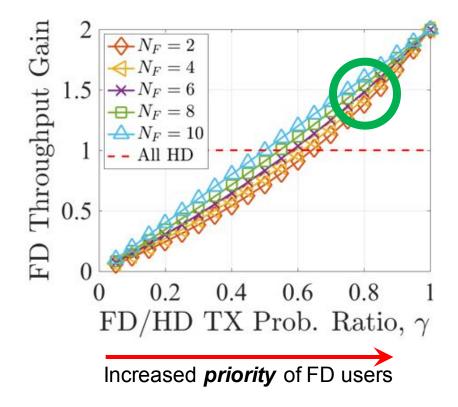


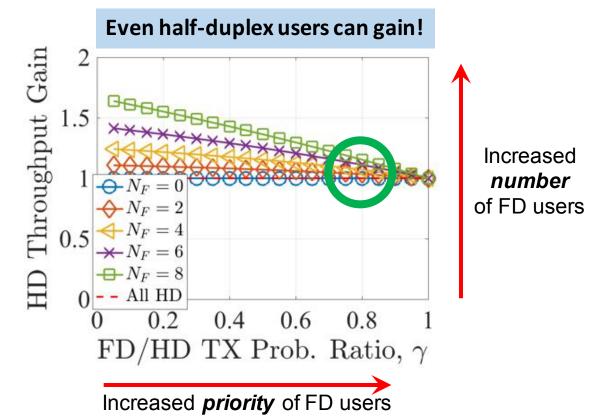
A heterogeneous network with fixed N and varying  $N_F$ 



# Introducing Full-Duplex Users – Everyone Gains!

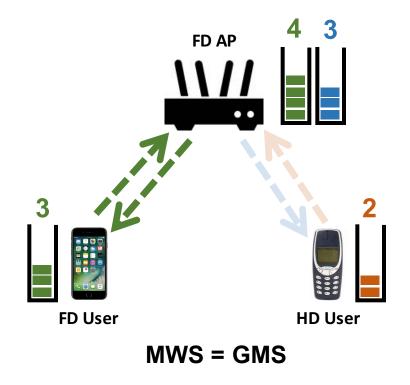
- A *homogeneous* network with N=10 half-duplex users **vs.** A *heterogeneous* network with  $N_H$  half-duplex users and  $N_F$  full-duplex users ( $N_H + N_F = N = 10$ )
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- With  $p_H = 0.5$ , throughput gain of *individual users*:

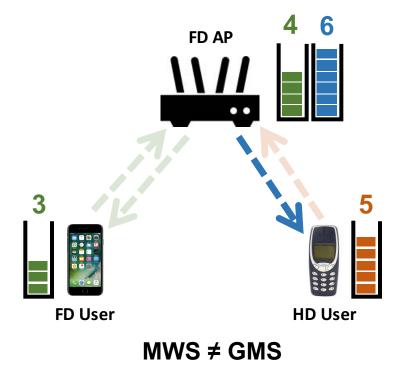




# Scheduling Algorithms

- Max-Weight Scheduling (MWS) is throughput-optimal
  - Q-CSMA can be applied
- What about the Greedy Maximal Scheduling (GMS)?
  - The returned schedule may not be Max-Weight





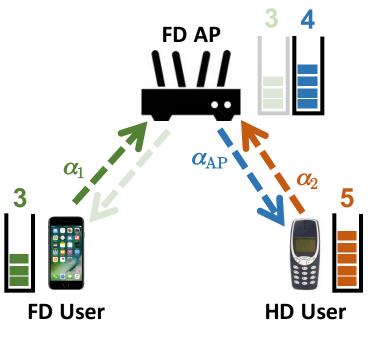
# Scheduling Algorithms

- Max-Weight Scheduling (MWS) is throughput-optimal
  - Q-CSMA can be applied
- What about the Greedy Maximal Scheduling (GMS)?
  - The returned schedule may not be Max-Weight
- <u>Proposition</u>: The centralized Greedy Maximal Scheduling (GMS) algorithm is throughput-optimal in <u>any</u> collocated <u>heterogeneous</u> half-duplex and full-duplex networks
  - Proof is based on local-pooling

- Question: How to achieve GMS is a distributed manner?
- Solution: H-GMS a Hybrid scheduling algorithm that combines centralized GMS and distributed Q-CSMA

If the previous slot is an *idle* slot:

- **Step 1: Initiation** (centralized GMS at the AP)
  - The AP selects the downlink with the longest queue
  - The AP draws an *initiator link* from all the uplinks and the selected downlink according to an access probability distribution  $\alpha$



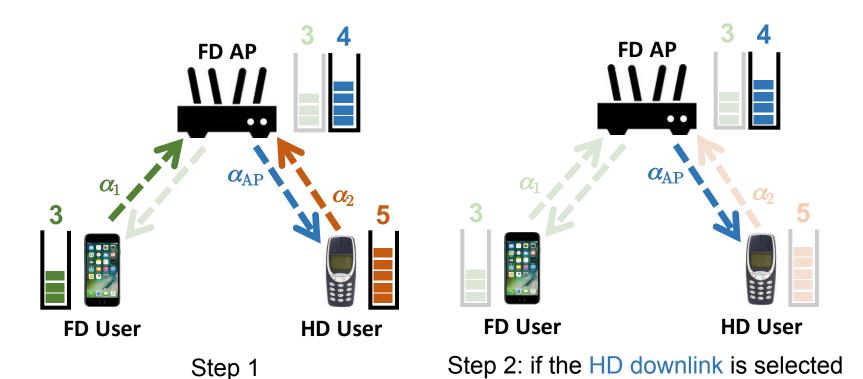
Step 1

If the previous slot is an *idle* slot:

- **Step 2: Coordination** (distributed Q-CSMA)
  - If link l is selected as the initiator link, it is activated w.p.  $p(Q_l(t))$

# Transmission probability and weight functions f(Q(t))

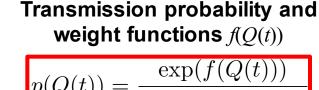
$$p(Q(t)) = \frac{\exp(f(Q(t)))}{1 + \exp(f(Q(t)))}$$

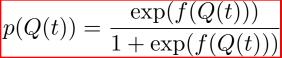


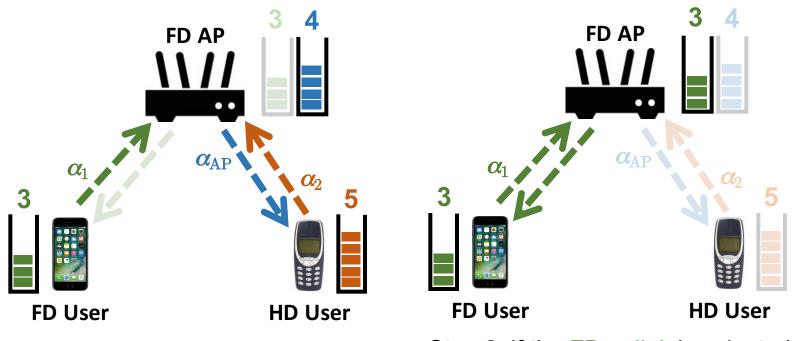
If the previous slot is an *idle* slot:

Step 1

- Step 2: Coordination (distributed Q-CSMA)
  - If link l is selected as the initiator link, it is activated w.p.  $p(Q_l(t))$
  - If the initiator link is a full-duplex uplink (downlink), the corresponding downlink (uplink) will also be activated



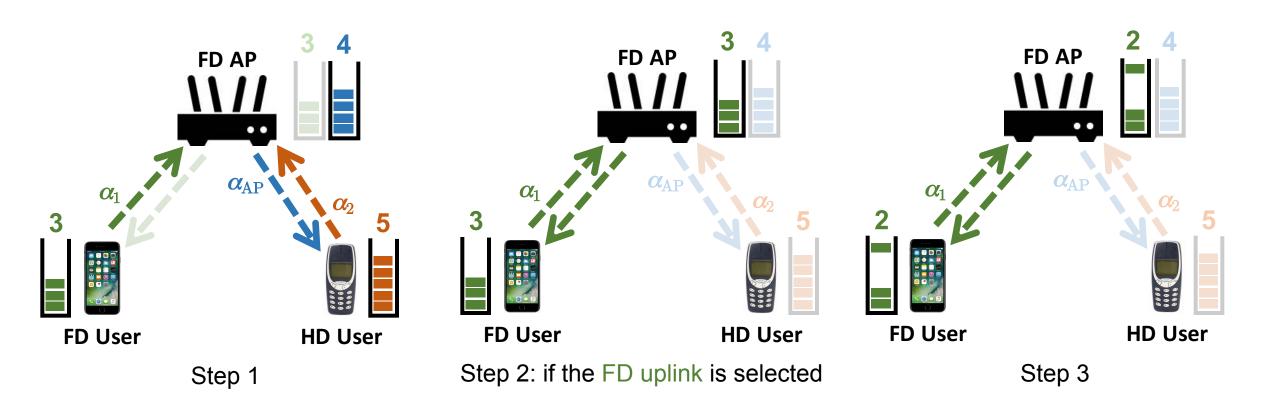




Step 2: if the FD uplink is selected

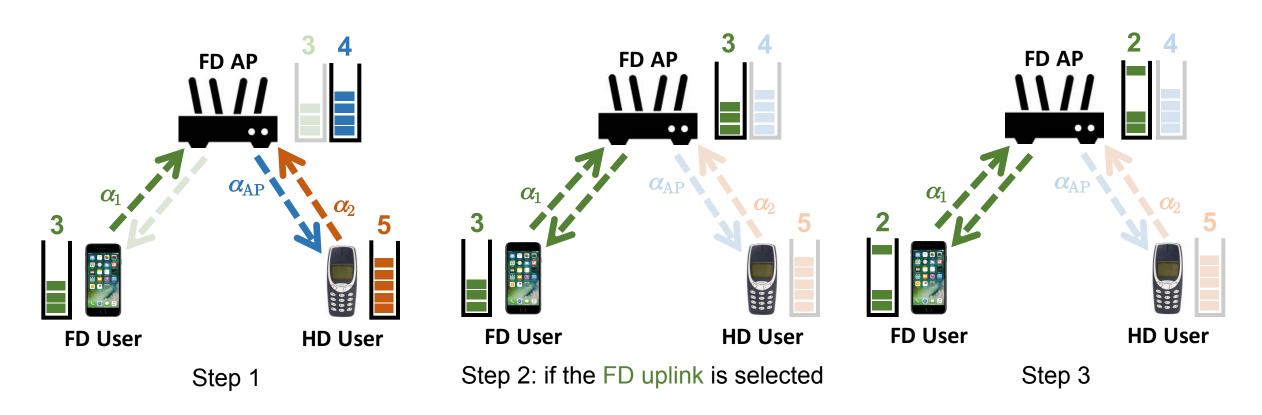
If the previous slot is an *idle* slot:

- Step 3: Transmission
  - One packet is transmitted on each activated link



If the previous slot is a **busy** slot:

The AP keeps the same initiator link and repeats steps 2 & 3

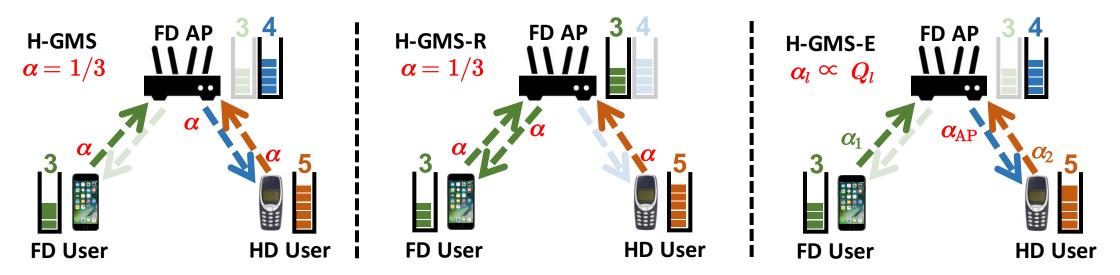


#### Main Results

- <u>Theorem</u>: For any arrival rate vector inside the capacity region, the system Markov chain (X(t), Q(t)) is positive recurrent under the H-GMS algorithm. The weight function f can be any nonnegative increasing function such that  $\lim_{x\to\infty} f(x)/\log(x) < 1$  or  $\lim_{x\to\infty} f(x)/\log(x) > 1$ .
  - Proof is based on fluid limit analysis

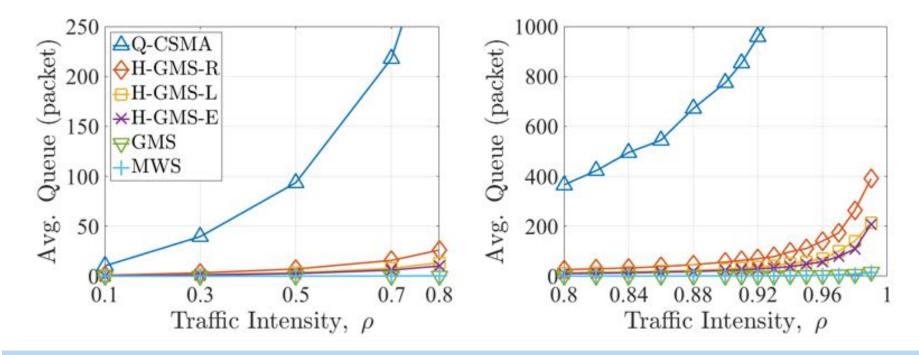
$$p(Q(t)) = \frac{\exp(f(Q(t)))}{1 + \exp(f(Q(t)))}$$

- Variants of *H-GMS*:
  - **H-GMS** (or **H-GMS-L**)
  - **H-GMS-R**: the AP selects a downlink queue uniformly at **R**andom,  $\alpha$  is uniformly distributed
  - **H-GMS-E**: the AP selects the downlink with the longest queue,  $\alpha$  is proportional to the **E**stimated uplink queues



#### Performance Evaluation – Queue Length

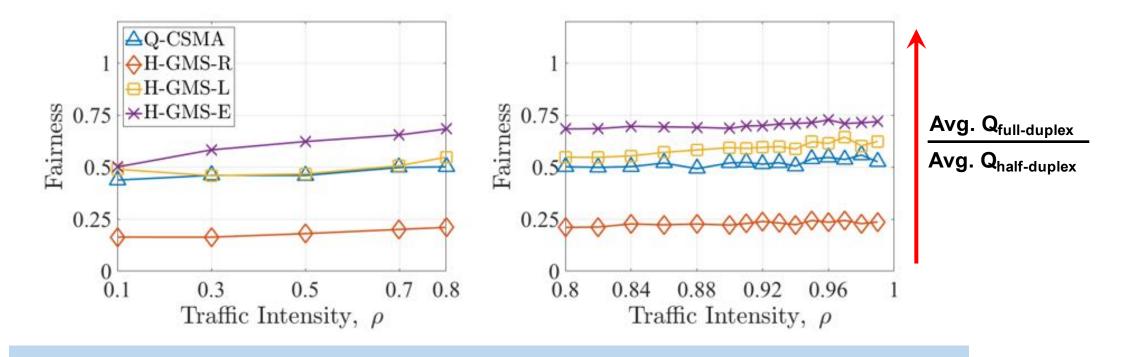
- Simulations with N=10 users with  $N_F=N_H=5$  in a heterogeneous network
- Equal arrival rate on all the uplinks and downlinks with total arrival rate  $\rho \in (0, 1]$
- Average queue length (packet) for every link



The largely reduced queue length resulted from (i) utilizing the centralized downlink queue information at the AP, and (ii) the introduction of full-duplex users

#### Performance Evaluation – Fairness

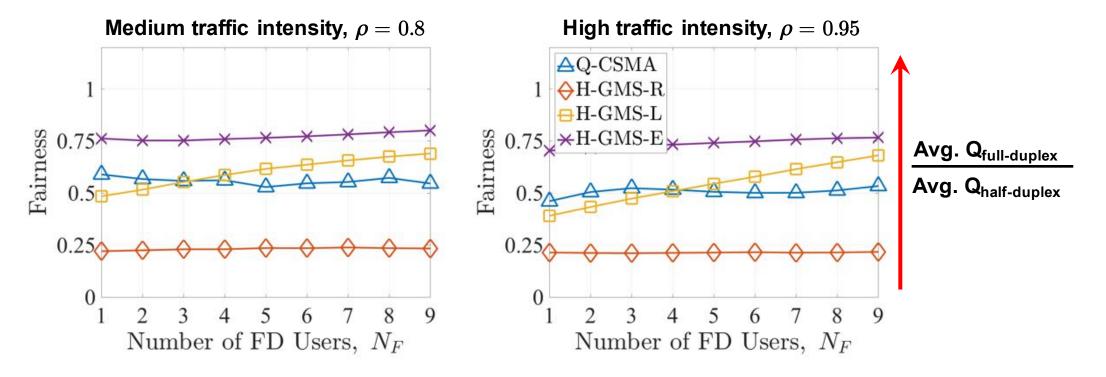
- Simulations with N=10 users with  $N_F=N_H=5$  in a heterogeneous network
- Equal arrival rate on all the uplinks and downlinks with total arrival rate  $\rho \in (0, 1]$
- Fairness between full-duplex and half-duplex users (i.e., ratio between their queue lengths)



**H-GMS-L** and **H-GMS-E** improve fairness by selecting the initiator link differently

#### Performance Evaluation – Effect of $N_F$

- Simulations with N=10 users with  $N_F=N_H=5$  in a heterogeneous network
- Equal arrival rate on all the uplinks and downlinks with total arrival rate  $\rho \in (0, 1]$
- *Fairness* under different values of  $N_F$



#### Summary

- Scheduling in heterogeneous half-duplex and full-duplex wireless networks
- All the users can gain (even for half-duplex users!) in terms of throughput when introducing full-duplex users into legacy half-duplex networks
- *H-GMS* a hybrid scheduling algorithm combining centralized GMS and distributed Q-CSMA, and is proven to be throughput-optimal
- Performance evaluation of H-GMS
- Future directions:
  - Delay analysis of H-GMS
  - Experimental evaluation using existing/customized full-duplex testbeds
- Please come to our full-duplex demo tomorrow at 9:30am if you are interested!







#### Thank you!

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http://www.ee.columbia.edu/~tc2668

Tingjun Chen, Jelena Diakonikolas, Javad Ghaderi, and Gil Zussman, "Hybrid Scheduling in Heterogeneous Half- and Full-Duplex Wireless Networks".



