**PhD Final Examination** 

## Analysis of Millimeter Wave Wireless Relay Networks

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## Outline

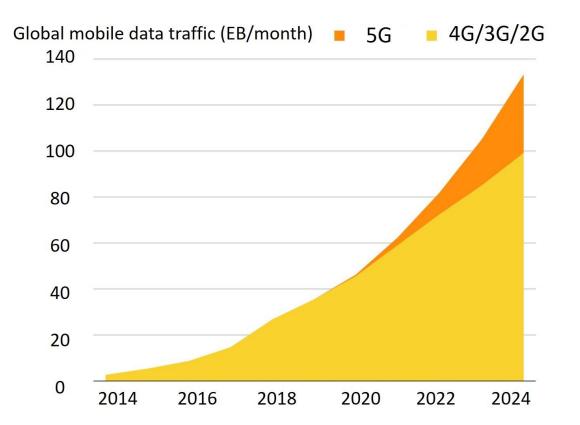
- Background and Motivation
- Major Contributions of the Thesis
  - Decode-and-forward (DF) relaying
  - Multi-hop relaying
  - Two-way relaying
  - Non-orthogonal multiple access DF relaying
- Conclusion and Future Research



## Background

#### Rocketing Mobile Data Growth

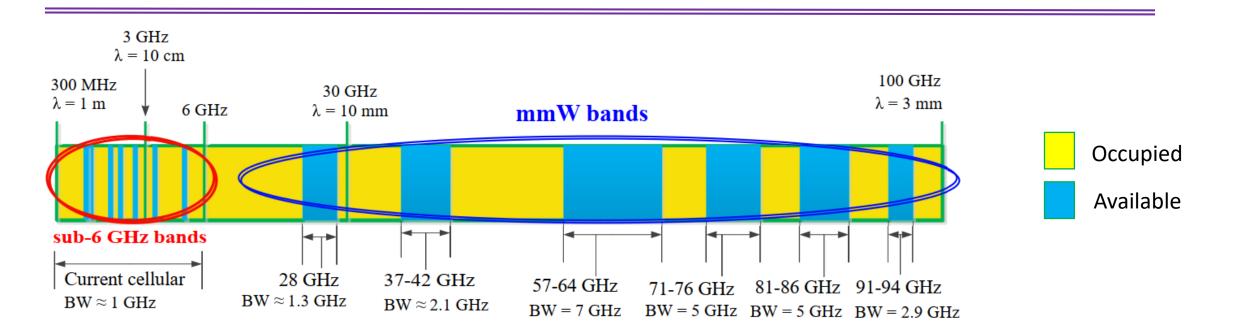
400% increase in 6 years! (2018-2024)



[1] Ericsson Mobility Report, November 2018



### High Data Rates via Millimeter Wave (mmW) Bands



#### Potential: Huge bandwidth opportunities! $\rightarrow$ Gbps data rates

Major issues: Path loss and blockage! → limit coverage distance



## Blockage Mitigation via Relays

Relaying can mitigate blockage and improve performance of mmW networks [1, 2, 3].

#### **Major Contributions of the Thesis**

Performance gains due to mmW relays in:

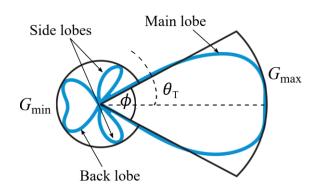
- 1. Decode-and-forward (DF) networks
- 2. Multi-hop networks
- 3. Two-way amplify-and-forward networks
- 4. Non-orthogonal multiple access DF networks



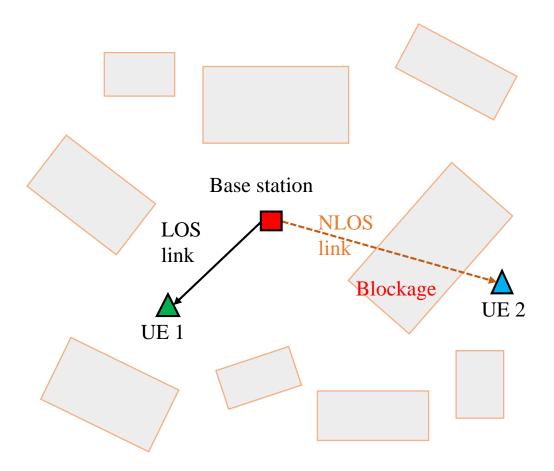
S. Rangan et al., "Millimeter-wave cellular wireless networks: Potential and challenges" *Proc. of the IEEE*, Mar. 2014.
 S. Biswas et al., "On the performance of relay aided millimeter wave networks," *IEEE J. Sel. Topics Signal Process.*, Apr. 2016.
 A. Chelli et al., "On bit error probability and power optimization in multihop millimeter wave relay systems," *IEEE Access*, Jan. 2018.

### Key mmW Concepts

• Beamforming



- Blockage
  - Line of Sight (LOS)
  - Non Line of Sight (NLOS)





#### Research Problem 1:

### Decode and Forward Relaying in mmW Networks [1]

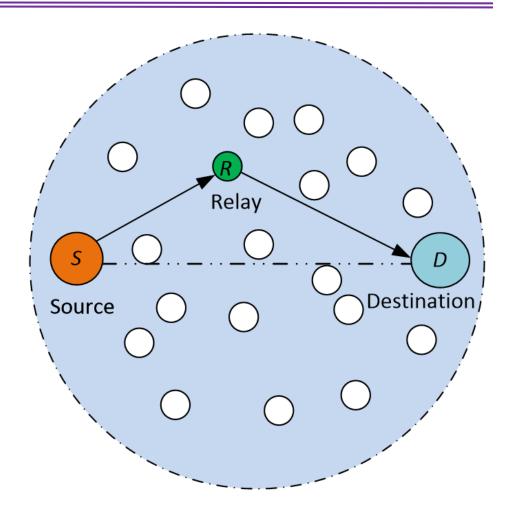
[1] K.Belbase et al., "Coverage Analysis of Decode and Forward Networks with Best Relay Selection", IEEE Access, June 2018



## **Problem Statement**

#### What is:

- coverage without relay?
- coverage due to random relay selection?
- coverage gain due to best relay selection?





## Significance of the problem and contribution

- Past Works:
  - AF relaying [1], no smallscale fading
  - D2D relaying [2], no small-scale fading, no NLOS

#### This Work:

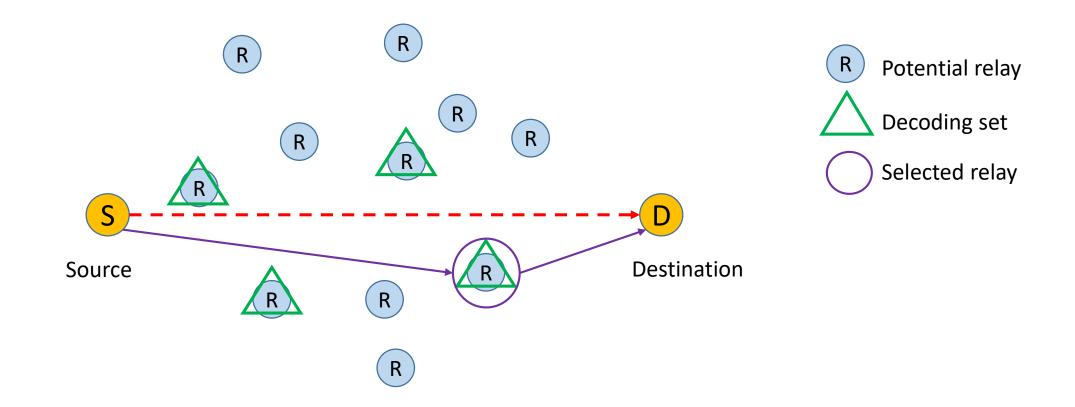
- DF networks
- best relay selection
- spatial randomness
- small-scale fading
- NLOS paths
- blockage

[1] S. Biswas et al., "On the performance of relay aided millimeter wave networks," *IEEE J. Sel. Topics Signal Process.*, Apr. 2016.

[2] S. Wu et al., "Improving the coverage and spectral efficiency of millimeter-wave cellular networks using device-todevice relays," *IEEE Trans. Commun.*, 2017



### **Best Relay Selection**





### **Coverage Probability with Best Relay Selection**

$$P_{\rm cov,SRD} = A_L P_{R,L}(\gamma_{\rm th}) + A_N P_{R,N}(\gamma_{\rm th}),$$

where,  $A_L$  – probability of selecting a LOS relay  $A_N$  – probability of selecting a NLOS relay

$$P_{R,l}(\gamma_{\rm th}), l \in \{L, N\}$$
 are given by  
 $P_{R,L}(\gamma_{\rm th}) \approx \sum_{k=1}^{m_L} (-1)^{k+1} {m_L \choose k} \int_{\theta=0}^{2\pi} \int_{z=0}^{\infty} e^{-kb_L z^{\alpha_L}} g_{r_L}(z) z dz d\theta,$ 

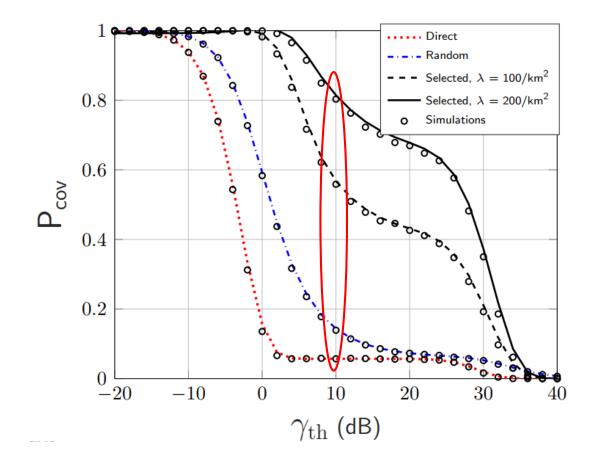
and

$$P_{R,N}(\gamma_{\rm th}) \approx \sum_{k=1}^{m_N} (-1)^{k+1} \binom{m_N}{k} \int_{\theta=0}^{2\pi} \int_{z=0}^{\infty} e^{-kb_N z^{\alpha_N}} g_{r_N}(z) z dz d\theta,$$

where 
$$b_L = rac{\eta_L \gamma_{
m th} N_0}{P_R \Psi}$$
, and  $b_N = rac{\eta_N \gamma_{
m th} N_0}{P_R \Psi}$ 



### **Numerical Results**



- Small gain due to random relay
- Significant gain due to relay selection
- Increasing relay density increases coverage

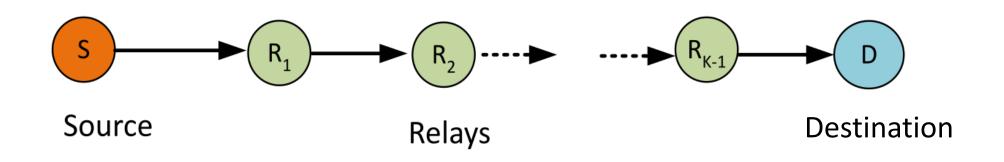


#### **Research Problem 2:**

### Multi-hop DF Relaying in mmW Networks



### Problem Statement



#### Major goals:

- What will be the coverage, capacity, and symbol error rates?
- What will be the effect of co-channel interference at relays and destination?



## Significance of the problem and contribution

- Past Works:
  - Multiple works on MAC and Network layers [1,2]
  - In PHY, BEP and power optimization of multi-hop AF [3],
    - ignores blockage
    - ignores NLOS
    - ignores sparse deployments

#### This Work:

- Multi-hop DF
- small-scale fading
- NLOS paths
- Blockage
- Sparse + dense scenario
- Coverage, Capacity, and SER

[1] J. García-Rois et al., "On the analysis of scheduling in dynamic duplex multihop mmwave cellular systems," *IEEE Trans. Wireless Commun.*, Nov. 2015.

[2] X. Lin et al., "Connectivity of millimeter wave networks with multi-hop relaying," *IEEE Wireless Commun. Lett.*, Apr. 2015.
[3] A. Chelli et al., "On bit error probability and power optimization in multihop millimeter wave relay systems," *IEEE Access*, Jan. 2018.



## Sparse Deployment (Noise Limited Case)

#### PDF of destination SNR

$$f_{\gamma_{\text{eq}}}(x) = \sum_{\mathbf{s}} p^{w(\mathbf{s})} q^{K-w(\mathbf{s})} \left(\frac{1}{\bar{\gamma}}\right) e^{-\frac{\Lambda_{\mathbf{s}}\mathbf{x}}{\bar{\gamma}}} \left(\Lambda_{\mathbf{s}} \sum_{m=0}^{\hat{k}} \mu_m^{\mathbf{s}} \left(\frac{x}{\bar{\gamma}}\right)^m - \sum_{m=1}^{\hat{k}} m \mu_m^{\mathbf{s}} \left(\frac{x}{\bar{\gamma}}\right)^{m-1}\right)$$

where,

p = LOS probability of a given hop q = NLOS probability of a given hop K = total number of hops  $\mathbf{S} = \text{total number of link states}$  $w(\mathbf{s}) = \text{weight of end-to-end link states}$ 

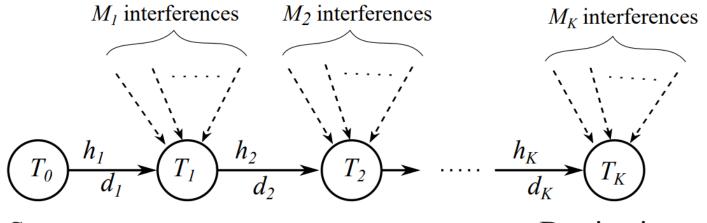
$$\Lambda_{\mathbf{s}} = \lambda_1^{s_1} + \dots + \lambda_K^{s_K}$$
$$\hat{k} = \sum_k \alpha_k - K$$

#### Use this PDF to derive:

- Coverage Probability
- Ergodic Capacity
- Asymptotic Capacity
- Symbol Error Rate (SER)



## Dense Deployment (Interference Limited Case)



Source

Destination

#### Two cases:

- Interferers at T<sub>k</sub> are i.i.d.
- Interferers at  $T_k$  are i.n.i.d.



## Distribution of sum of i.n.i.d. Gamma r.v.s

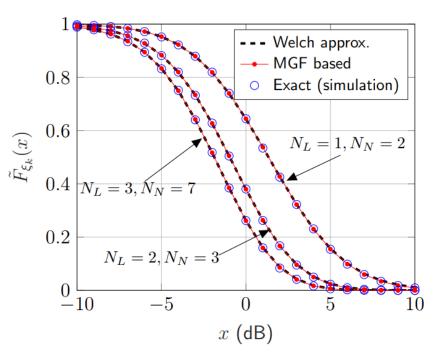
• MGF Based approach: for integer shape parameters

$$\tilde{F}_{\xi_k}(x) = \sum_{m=0}^{\alpha_k - 1} \frac{(-1)^m (x\lambda_k/\zeta_k)^m}{m!} \mathcal{M}^m_{I_k}(x\lambda_k/\zeta_k)$$

• Welch-Satterthwaite Approximation

Let  $Y = X_1 + X_2 + \dots + X_{M_k}$ , with mutually independent  $X_n \sim \mathcal{G}(\alpha_n, \lambda_n)$  for  $n = 1, \dots, M_k$ . Then Y is approximately  $\mathcal{G}(\alpha_y, \lambda_y)$ , where  $\alpha_y = \frac{\mu^2}{\sum_{n=1}^{M_k} \alpha_n \lambda_n^2}$ ,  $\lambda_y = \frac{\mu}{\alpha_y}$  and  $\mu = \sum_{n=1}^{M_k} \alpha_n \lambda_n$ .

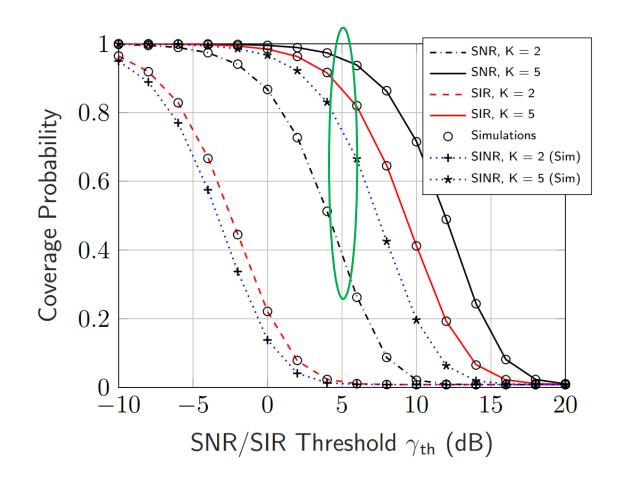
SIR distribution  $\rightarrow$  i.i.d. interference case



- Very well approximated!
- Used for Ergodic Capacity and SER evaluation



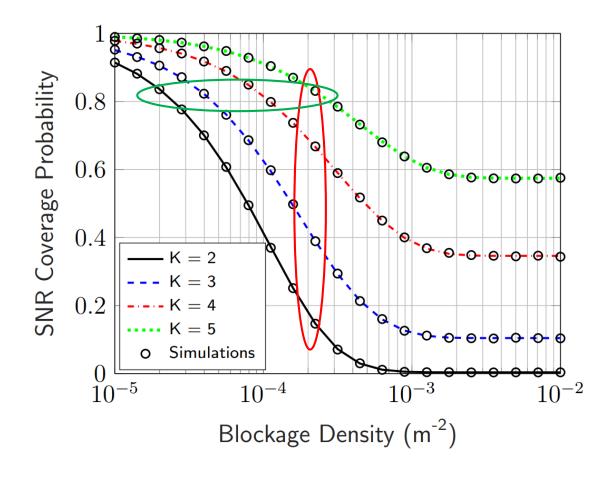
### **Numerical Results**



- SINR results given for comparison
- Coverage improves in each case when going from K=2 to K=5
- Gain of 40% to 95% from K=2 to K =5 for 5 dB SNR threshold



### **Coverage vs Blockage**



Increase in K mitigates blockage

> 300% gain from K=2 to K=5!



#### **Research Problem 3:**

### **Two-way Relaying in mmW Networks [1]**

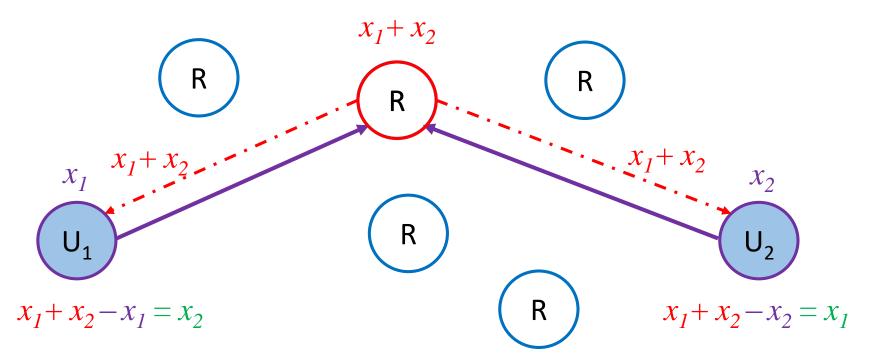
[1] K. Belbase et.al "Two-way Relay Selection in Millimeter Wave Networks," IEEE Communications Letters, Jan. 2018



## **Two-way Relays**

Problem with one way relay – 4 time-slots to exchange two user message

Two-way relay can do it in 2 time slots – doubles SE compared to one-way

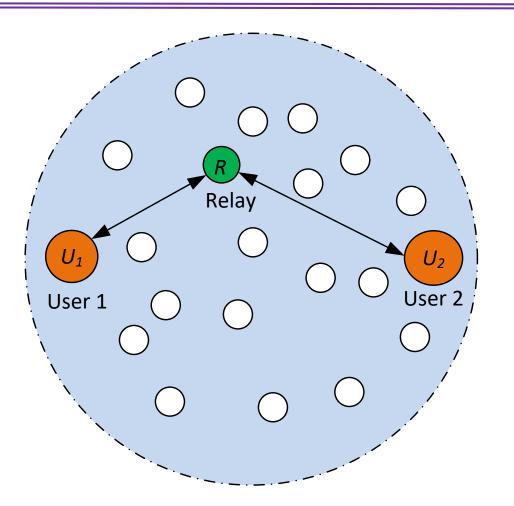




### **Problem Statement**

#### Major goal:

What is coverage gain due to relay selection?





## Significance of the problem and contribution

- Many existing works on sub-6 GHz
   not directly applicable
- Two-way mmW relay [1] beamforming design aspects but no relay selection, no spatial randomness

- This Work:
  - Two-way AF relays
  - Log-normal shadowing
  - Relay selection
  - Spatial randomness
  - Blockage



### **Coverage Probability**

$$P_{\rm cov} = 1 - e^{-\lambda|\mathcal{S}|} \left( e^{\lambda|\mathcal{S}|\nu} - 1 \right)$$

where

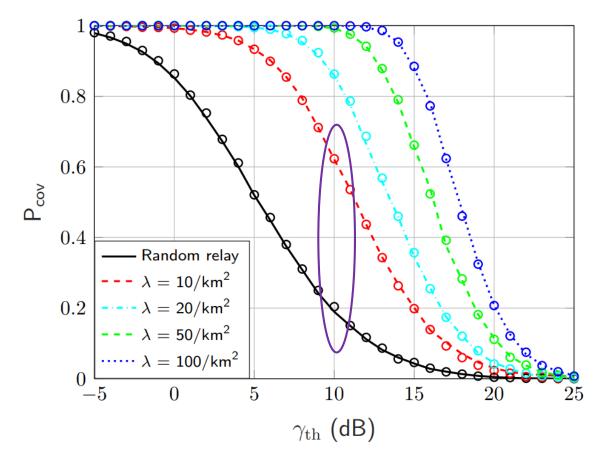
$$\nu = \mathbb{E}_{z} \Big[ F_{\gamma_{z}}(\gamma_{th}) \Big] = \frac{1}{|\mathcal{S}|} \int_{0}^{2\pi} \int_{0}^{r_{d}} F_{\gamma_{z}}(\gamma_{th}) r dr d\theta$$

where  $F_{\gamma_z}(\gamma_{th})$  is the conditional CDF of end-to-end SNR  $\gamma_z$ .



## **Numerical Results**

- 200% coverage gain with selection!
- Gain due to increasing density



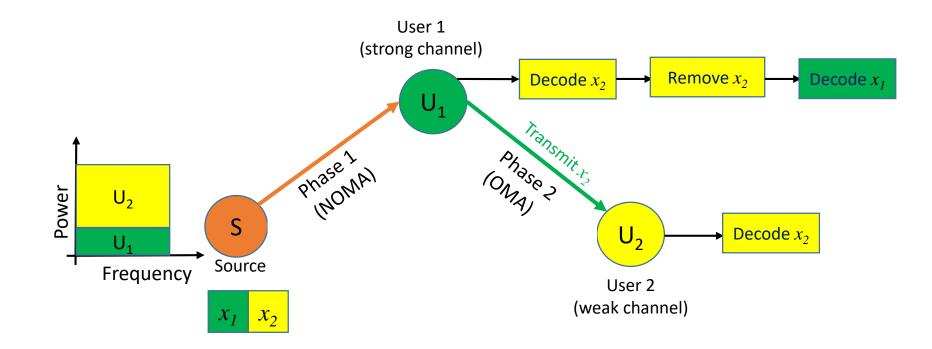


#### Research Problem 4:

#### **Cooperative NOMA in mmW Networks**



## **Cooperative NOMA Operation**



• 3 time-slots in OMA vs 2 time-slots using NOMA



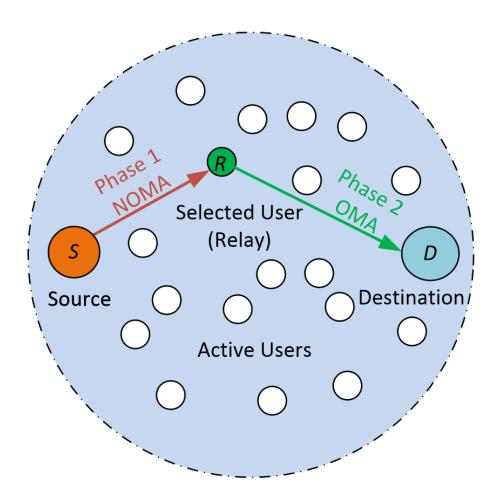
## **Problem Statement**

#### 3 Relay Selection Schemes

- Nearest-to-source selection (Scheme  $S_1$ )
- Nearest-to-destination selection (Scheme  $S_2$ )
- Random Selection (Scheme S<sub>3</sub>)

#### Major goal:

What is the coverage due to different relay selection schemes?





## Significance of the problem and contribution

- Improved spectral efficiency with NOMA
- Use of mmW relays to mitigate blockage
  - Joint use of NOMA and relays can achieve both
- Existing works
  - Cooperative NOMA [1] not applicable in mmW, fixed relays
  - mmW NOMA [2] do not include relaying

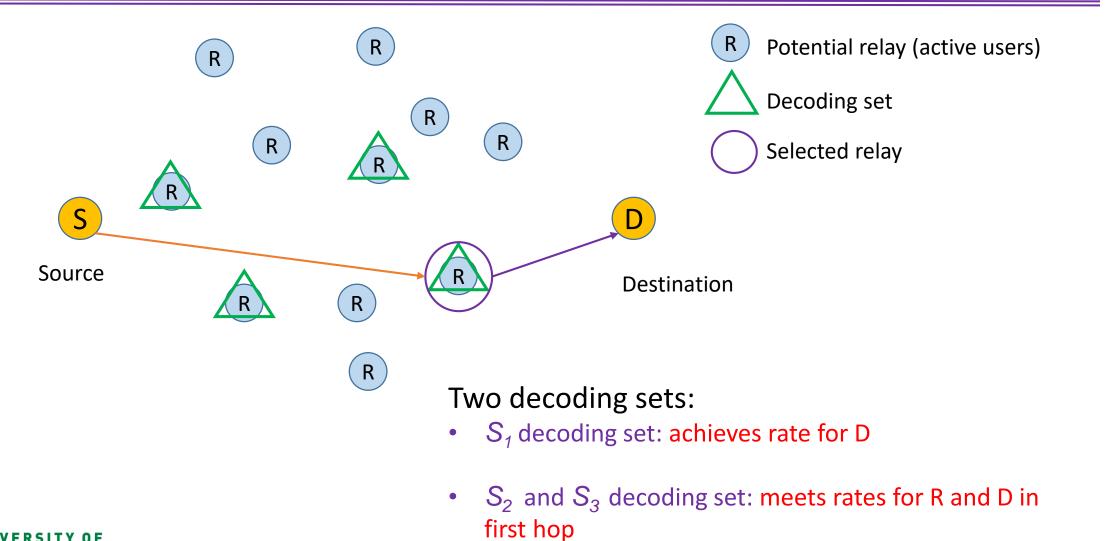
#### • This Work:

- Cooperative NOMA with DF relays
- Small scale fading
- Spatial randomness
- Blockage
- Different relay selection schemes

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[1] Z. Ding et al., "Relay Selection for Cooperative NOMA," IEEE Wireless Commun. Lett., Aug. 2016
[2] Y. Zhou et al., "Coverage and rate analysis of millimeter wave NOMA networks with beam misalignment," IEEE Trans. Commun., Dec. 2018

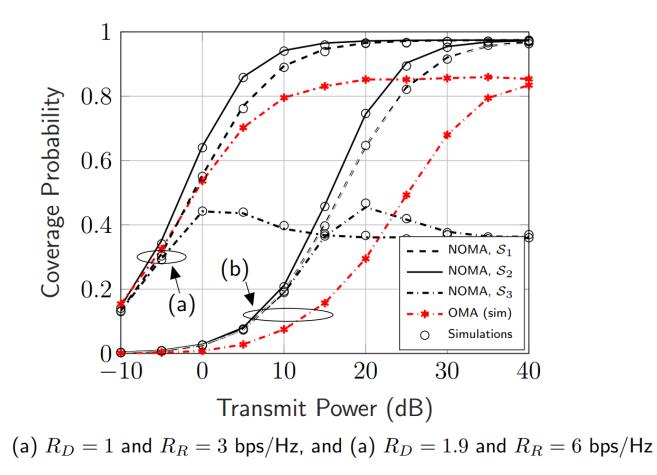
## **Relay Selection**





## **Numerical Results**

- Higher coverage for lower rate requirements
- S<sub>1</sub> and S<sub>2</sub> perform
   better than orthogonal
   transmission
- Random relay performs poorly than orthogonal case





#### **Conclusion and Future Research**





Coverage and rate of a DF relay network – minimum path loss relay

Coverage, capacity and SER of a multi-hop DF relay network – noiselimited and interference-limited scenarios

Coverage and rate of a two-way AF relay network – relay with best SNR at both users,

Coverage and rate of a cooperative NOMA network – three relay selection schemes



## **Future Research**

Interference analysis of mmW DF relay network

Stochastic geometry based interference analysis of multi-hop relay network

SER of M-QAM modulation schemes in interference limited multi-hop network



# Thank you!

