



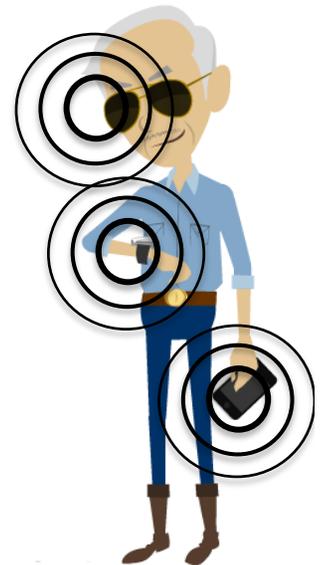
Coverage and Rate in Finite-Sized Device-to-Device Millimeter Wave Networks

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Wearable communication networks



- ◆ The **next frontier** for wireless communications
 - ✦ Multiple devices in and around human body
 - ✦ **Low-rate** fitness monitors to **high-rate** infotainment devices
- ◆ Critical challenge
 - ✦ Supporting Gbps per user in **dense** environments
 - ✦ Effective operation in **finite areas** like trains, trolleys, or buses

[1] <http://www.bombardier.com/en/transportation/products-services/railvehicles/metros.html>

[2] "Smart wearable devices: Fitness, healthcare, entertainment & enterprise 2013-2018," Juniper Research, Oct. 2013.

MmWave as solution for wearable networks



- ◆ High bandwidth and reasonable isolation
- ◆ Compact antenna arrays to provide array gains via beamforming
- ◆ Commercial products already available: IEEE 802.11ad, WirelessHD

¹ 47 CFR 15.255; ² ARIB STD-T69, ARIB STD-T74; ³ Radiocommunications Class License 2000; ⁴ CEPT : Official journal of the EU;

Motivating prior work

- ◆ Stochastic geometry models for mmWave cellular networks [1]-[3]
 - ✦ Infinite spatial extent and number of nodes
 - ✦ Did not consider people as a source of blockage
- ◆ Performance analysis for finite ad-hoc networks [4]
 - ✦ Does not include directional antennas or blockage
- ◆ Self-blockage model for mmWave [5]
 - ✦ Considers a 5G cellular system
 - ✦ User's own body blocks the signal, not other users

[1] T. Bai and R. W. Heath Jr., "Coverage and rate analysis for millimeter wave cellular networks," IEEE Trans. Wireless Comm., 2014.

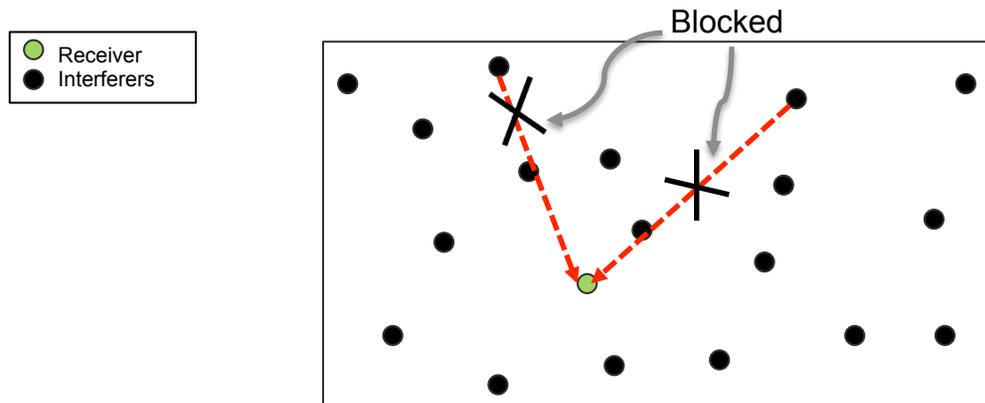
[2] S. Singh, M. N. Kulkarni, A. Ghosh, and J. G. Andrews, "Tractable model for rate in self-backhauled millimeter wave cellular networks," online

[3] T. Bai, A. Alkhateeb, and R. W. Heath Jr., "Coverage and capacity of millimeter-wave cellular networks," IEEE Commun. Magazine, 2014.

[4] D. Torrieri and M. C. Valenti, "The outage probability of a finite ad hoc network in Nakagami fading," IEEE TCOM, 2012.

[5] T. Bai and R. W. Heath Jr., "Analysis of self-body blocking effects in millimeter wave cellular networks," in Proc. Asilomar 2014.

What is different for mmWave wearable networks?



2D geometry

- ◆ Finite number of **interferers** in a **finite network region**
 - ★ Realistic assumption for the **indoor** wearable setting w/ mmWave
 - ★ Fixed/random location of interferers (extended in journal version)
- ◆ Blockages due to other human bodies
- ◆ Both **interferer** and **blockage** associated with a user

Contributions

- ◆ Model **interferers** as also **potential blockages**

- ◆ Analyze SINR distribution and rate

- ★ Finite-sized mmWave-based wearable networks

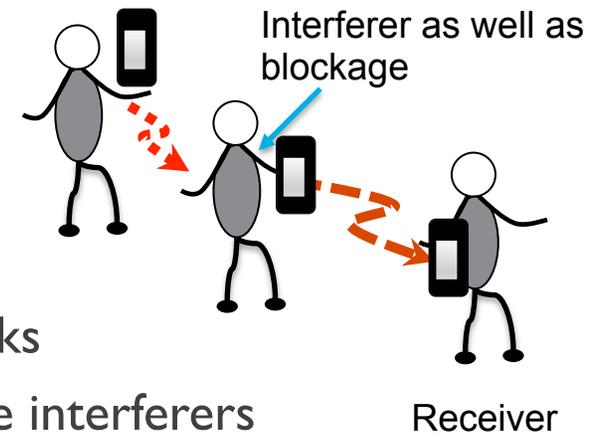
- ★ Initially, conditioned on a **fixed location** for the interferers

- ★ Conditioning can be removed by averaging over the spatial distribution

- ◆ Assess impact of antenna parameters on performance

- ★ Factor in array **size** and **gain**

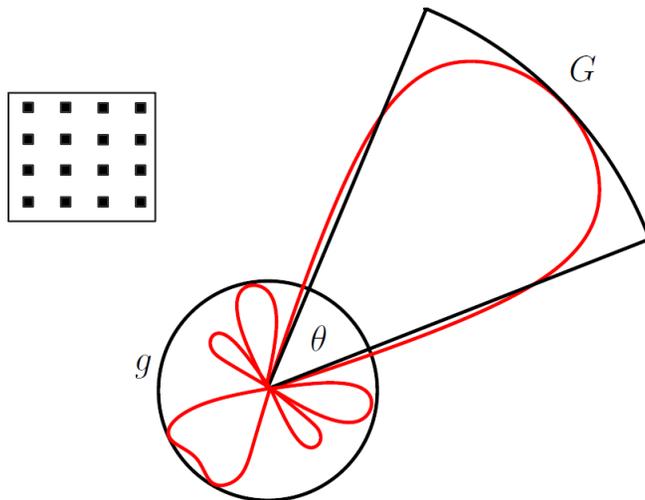
- ★ Incorporate antenna **directivity** and **orientation**





SYSTEM MODEL

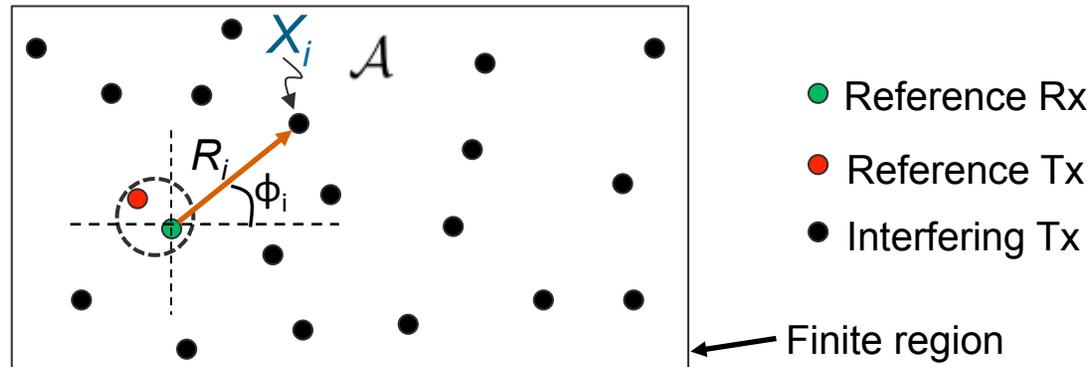
Modeling antenna pattern using a sectored antenna



Number of antenna elements	N
Beamwidth θ	$2\pi / \sqrt{N}$
Main-lobe gain G	N
Side-lobe gain g	$1 / \sin^2(3\pi / 2\sqrt{N})$

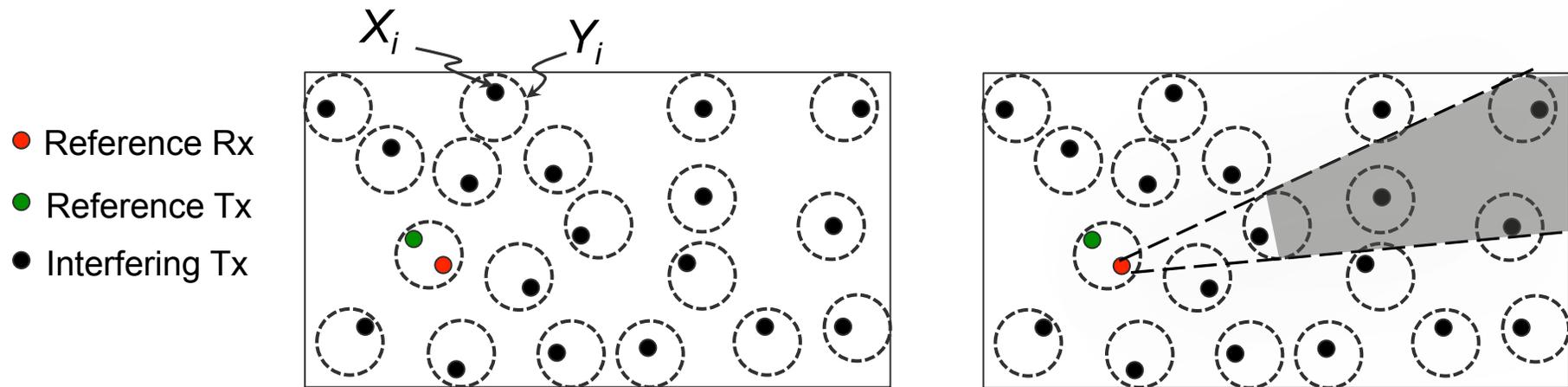
- ◆ Use a 2D sectored antenna model to simplify the analysis
 - ★ Parameterize via a uniform planar square array w/ half-wavelength spacing
- ◆ Incorporates omni-directional antennas as a special case
 - ★ $N = 1 \rightarrow$ omni-directional antenna, $G = g = 1$
 - ★ Of interest for inexpensive wearable

Network topology



- ◆ Finite sized network region \mathcal{A} , area = $|\mathcal{A}|$, $K+1$ users
- ◆ One interferer per user transmits at a time
 - ★ K interferers + reference transmitter-receiver pair
- ◆ $X_i = R_i e^{j\phi_i}$, location of transmitters relative to reference receiver
 - ★ X_0 is location of the **reference** transmitter
 - ★ X_1, \dots, X_K are the locations of the **interferers**.

Modeling human body blockages



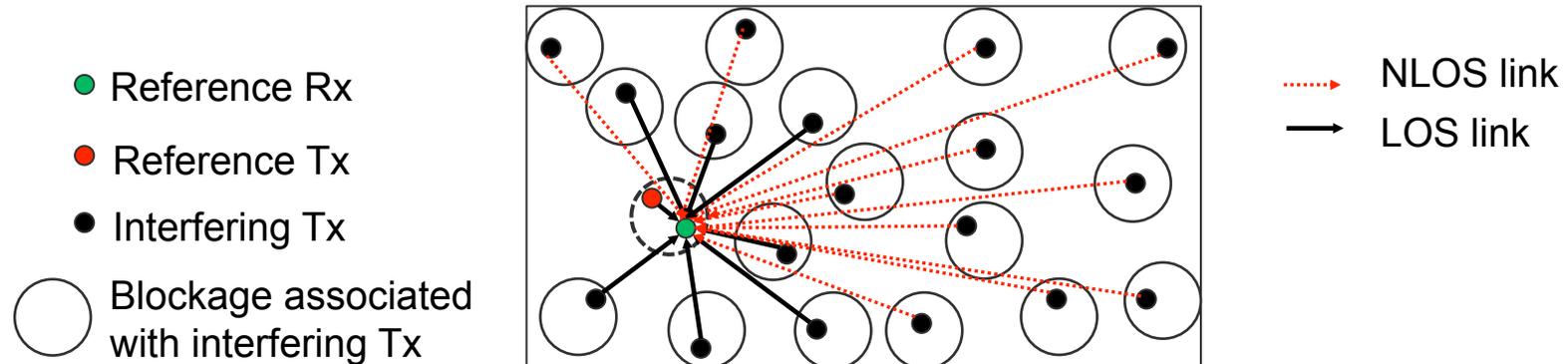
- ◆ Associate diameter W circle with each user – denoted Y_i
- ◆ Determine **blocking cone** for each Y_i
- ◆ X_i blocked if it falls in one of the blocking cones
- ◆ Assume Y_i does not block X_i , i.e., no self-blocking





SIGNAL MODEL

Received signal model



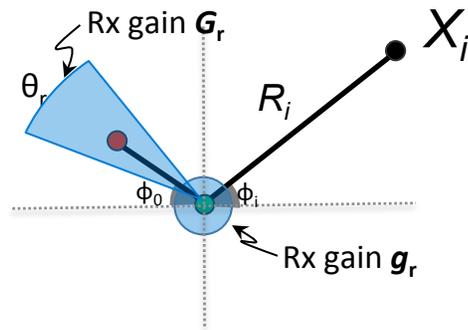
◆ h_i - Nakagami fading with parameter m_i from X_i

◆ Link is NLOS if blocked and LOS otherwise

$$\underbrace{\hspace{2cm}}_{\downarrow} \\ m_i = m_N$$

$$\underbrace{\hspace{2cm}}_{\downarrow} \\ m_i = m_L$$

Path-loss model and power gains



- Reference Rx
- Reference Tx
- Interfering Tx

◆ α_i - path-loss exponent from X_i

◆ Define

Captures path loss and Rx orientation

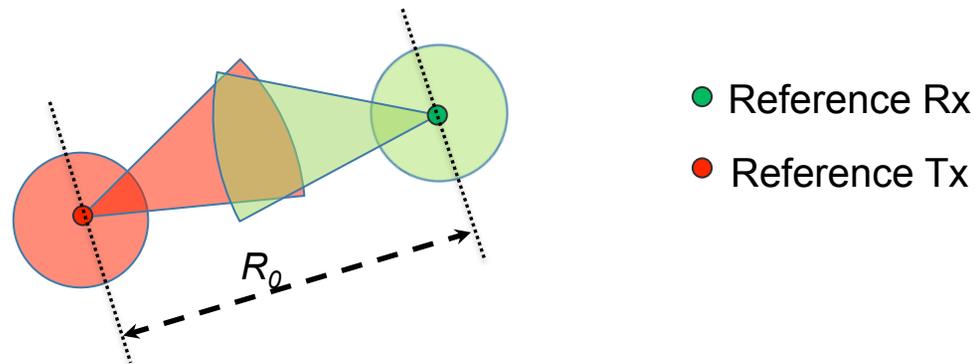
$$\Omega_i = \begin{cases} \frac{P_i}{P_0} G_r R_i^{-\alpha_i} \\ \frac{P_i}{P_0} g_r R_i^{-\alpha_i} \end{cases}$$

Tx power of X_i

Ref. receiver's main-lobe points towards X_i

$$\left. \begin{matrix} \text{if } -\frac{\theta_r}{2} \leq \phi_i - \phi_0 \leq \frac{\theta_r}{2} \\ \text{otherwise} \end{matrix} \right\}$$

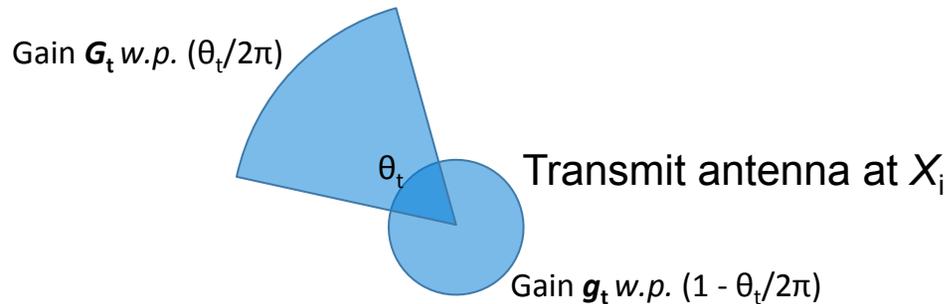
Signal from reference transmitter



- ◆ h_0 – Nakagami fade gain from reference with parameter m_0
- ◆ Assume that there is **always LOS** communication
- ◆ Reference Tx is within the main beam of the reference Rx

$$\Omega_0 = G_r R_0^{-\alpha_0}$$

Relative transmit power



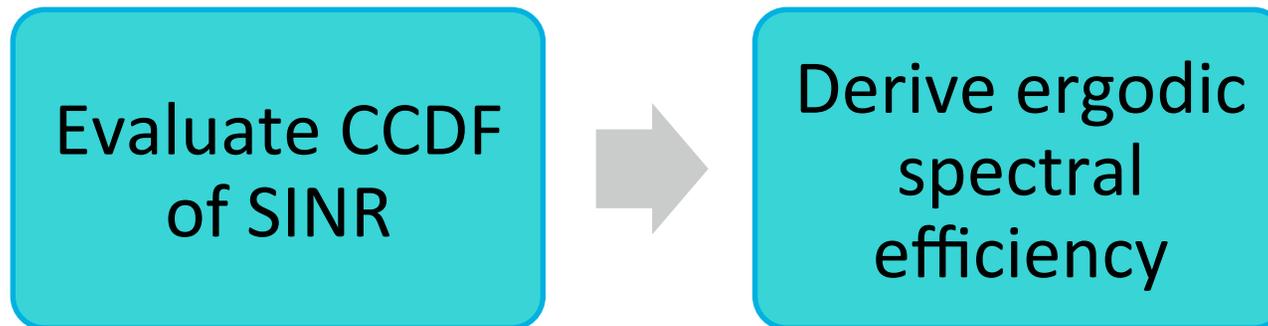
- ◆ X_i transmits with probability p_t (Aloha-like medium access)
- ◆ X_i points its main-lobe in a (uniform) random direction
- ◆ Define

$$I_i = \begin{cases} 0 & w.p. (1 - p_t) \\ G_t & w.p. p_t \left(\frac{\theta_t}{2\pi} \right) \\ g_t & w.p. p_t \left(1 - \frac{\theta_t}{2\pi} \right) \end{cases}$$

Captures p_t and random Tx orientation

Probability that ref. receiver is within main-lobe of X_i

SINR and ergodic spectral efficiency



◆ SINR is

$$\gamma = \frac{h_0 \Omega_0}{\sigma^2 + \sum_{i=1}^K I_i h_i \Omega_i}$$

Noise power normalized by P_0

CCDF of SINR

- ◆ SINR coverage probability for a given $\mathbf{\Omega} = [\Omega_0, \dots, \Omega_K]$

$$P_c(\beta) = \mathbb{P}[\gamma > \beta | \mathbf{\Omega}]$$

threshold

$$P_c(\beta) = \mathbb{P}\left[S > \sigma^2 + \sum_{i=1}^K Y_i \mid \mathbf{\Omega}\right],$$

where

$$S = \beta^{-1} h_0 \Omega_0, \quad Y_i = I_i h_i \Omega_i.$$

$$P_c(\beta) = \int_{\mathbb{R}^K} \dots \int \left(\int_{\sigma^2 + \sum_{i=1}^K y_i}^{\infty} f_S(s) ds \right) f_{\mathbf{Y}}(\mathbf{y}) d\mathbf{y}$$

CCDF of SINR

- ◆ SINR coverage probability for a given $\mathbf{\Omega} = [\Omega_0, \dots, \Omega_K]$

$$P_c(\beta) = \mathbb{P}[\gamma > \beta | \mathbf{\Omega}]$$

threshold \nearrow

$$P_c(\beta) = e^{-\beta_0 \sigma^2} \sum_{\ell=0}^{m_0-1} \frac{(\beta_0 \sigma^2)^\ell}{\ell!} \sum_{t=0}^{\ell} \binom{\ell}{t} \frac{t!}{\sigma^{2t}} \sum_{\substack{t_i \geq 0 \\ \sum_{i=1}^K t_i = t}} \left(\prod_{i=1}^K \mathcal{G}_{t_i}(\Omega_i) \right),$$

where

$$\mathcal{G}_{t_i}(\Omega_i) = p_t \left(\frac{\Omega_i}{m_i} \right)^{t_i} \frac{\Gamma(m_i + t_i)}{t_i! \Gamma(m_i)} \left[\frac{\theta_t}{2\pi} \psi_{t_i}(G_t) + \left(1 - \frac{\theta_t}{2\pi} \right) \psi_{t_i}(g_t) \right] + (1 - p_t) \delta[t_i],$$

$$\delta[t_i] = \begin{cases} 1 & \text{if } t_i = 0 \\ 0 & \text{if } t_i \neq 0 \end{cases},$$

$$\psi_{t_i}(x) = x^{t_i} \left(1 + \frac{\beta_0 x \Omega_i}{m_i} \right)^{-(m_i + t_i)}$$

Rate (Spectral Efficiency)

- ◆ For a threshold β , the spectral efficiency is

$$\eta = \log_2(1 + \beta)$$

- ◆ The ccdf of the spectral efficiency is found by defining equivalent rates

$$\{\gamma > \beta\} \Leftrightarrow \underbrace{\{\log_2(1 + \gamma) > \eta\}}_{\{\gamma > 2^\eta - 1\}}$$

- ◆ Since they are equivalent

$$P_\eta(r) = P_c(2^r - 1)$$

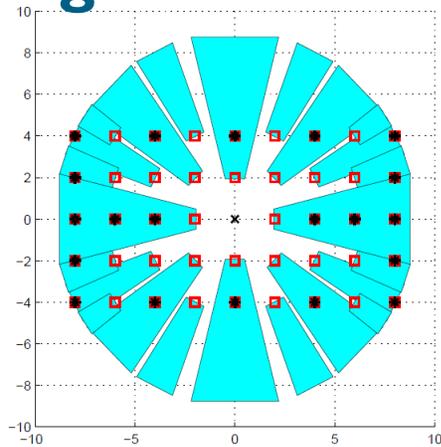
- ◆ And the ergodic spectral efficiency is found from:

$$\mathbb{E}[\eta] = \int_0^\infty P_c(2^r - 1) dr = \frac{1}{\log(2)} \int_0^\infty \frac{P_c(\beta)}{1 + \beta} d\beta.$$

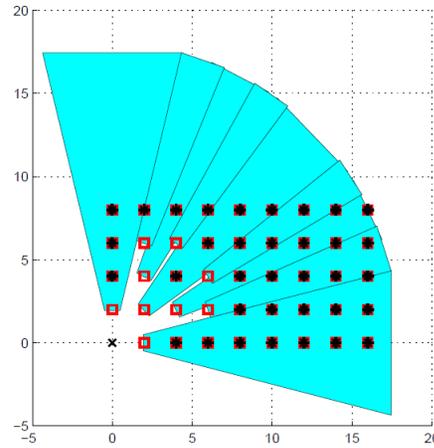


NUMERICAL RESULTS: (FIXED NETWORKS)

Setting



Receiver at center

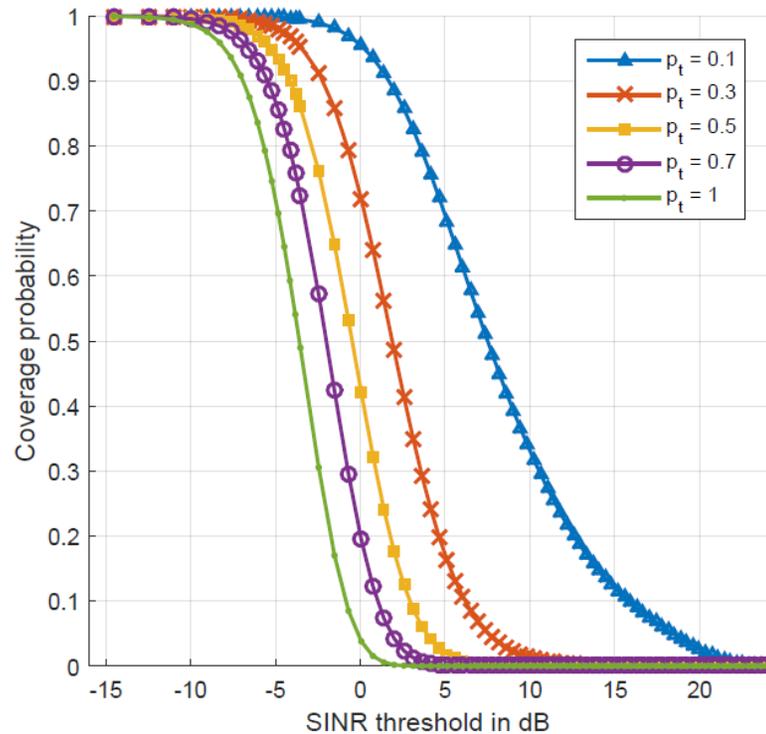


Receiver at a corner

- ◆ 5 X 9 rectangular grid
- ◆ Separation between nodes = $2R_0$
- ◆ No reflection from boundaries
- ◆ All nodes transmit with same P_i

Parameter	Value
s	
R_0	1
m_L	4
m_N	2
α_L	2
α_N	4
W	1
σ^2	-20 dB
K	44

CCDF of SINR: Dependence on p_t

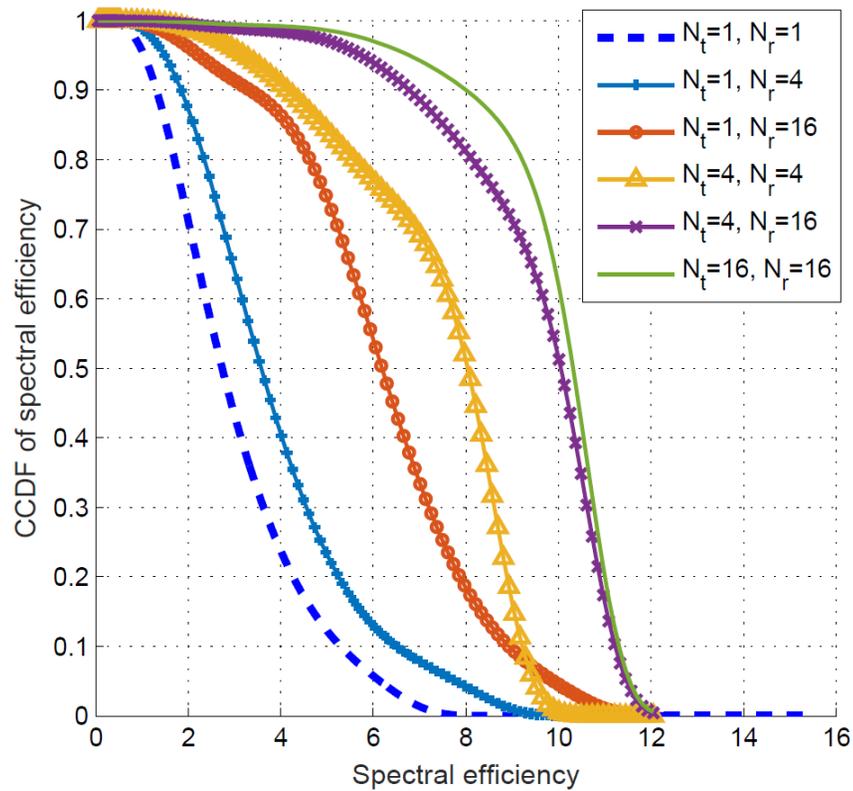


Omni Tx and Rx

Receiver at the center

- ◆ Higher transmission probability p_t results in smaller SINR
- ◆ Similar trend with other antenna configurations

Spectral efficiency for different antenna configurations

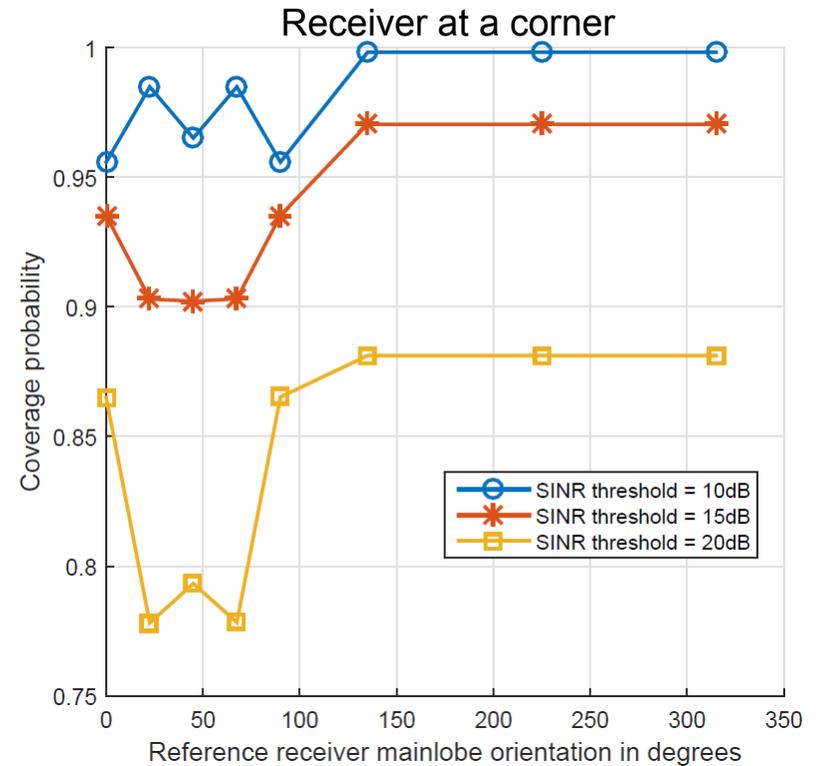
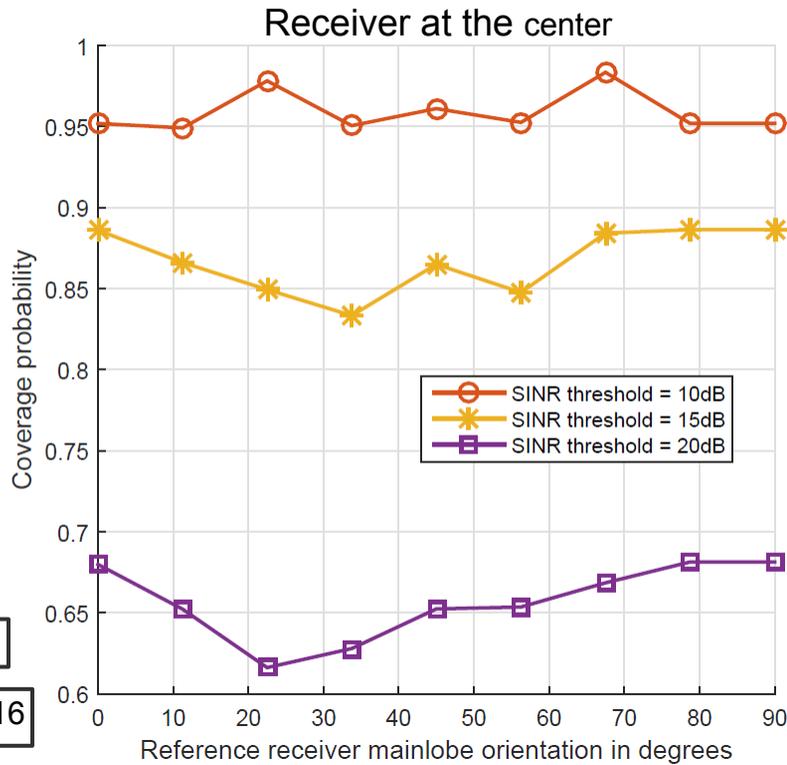


$$p_t = 0.1$$

Receiver at the center

Larger antenna arrays perform better

Effect of receive antenna orientation



$\rho_t = 0.7$
 $N_t = N_r = 16$

Orientation of receiver more important at corner

Rate trends with N_t and N_r

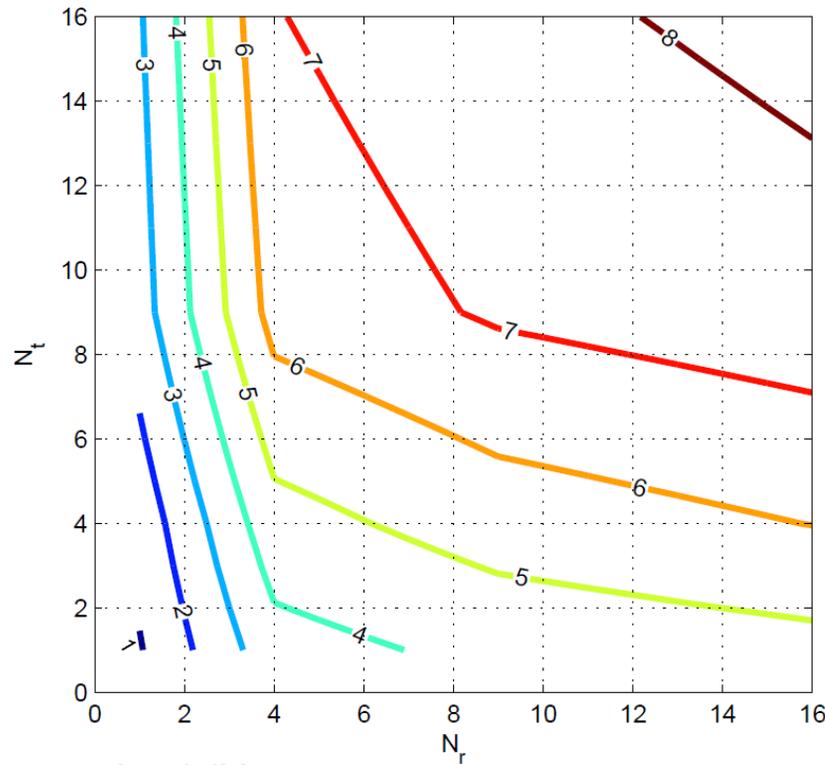
Assume 2.16 GHz BW of IEEE 802.11ad

N_t	N_r	Ergodic spectral efficiency (bits/s/Hz)		Rate (Gb/s)	
		Receiver at center	Receiver at a corner	Receiver at center	Receiver at a corner
1	1	0.499	1.063	1.08	2.30
1	4	0.797	1.405	1.72	3.03
1	16	1.757	2.087	3.80	4.51
4	1	2.449	4.046	5.29	8.74
4	4	3.210	5.072	6.93	10.96
4	16	5.437	7.078	11.74	15.29
16	1	3.618	5.027	7.81	10.86
16	4	4.635	6.396	10.01	13.82
16	16	6.952	8.434	15.02	18.22

$$\rho_t = 1$$

Gigabit throughputs are achieved even with a single transmit and receive antenna

Contour plot of ergodic spectral efficiency



*Units in bits/s/Hz

$\rho_t = 0.5$

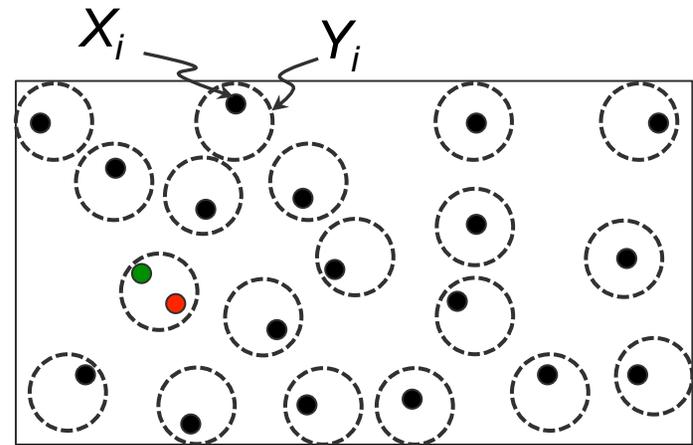
Receiver at the center



RANDOM NETWORKS

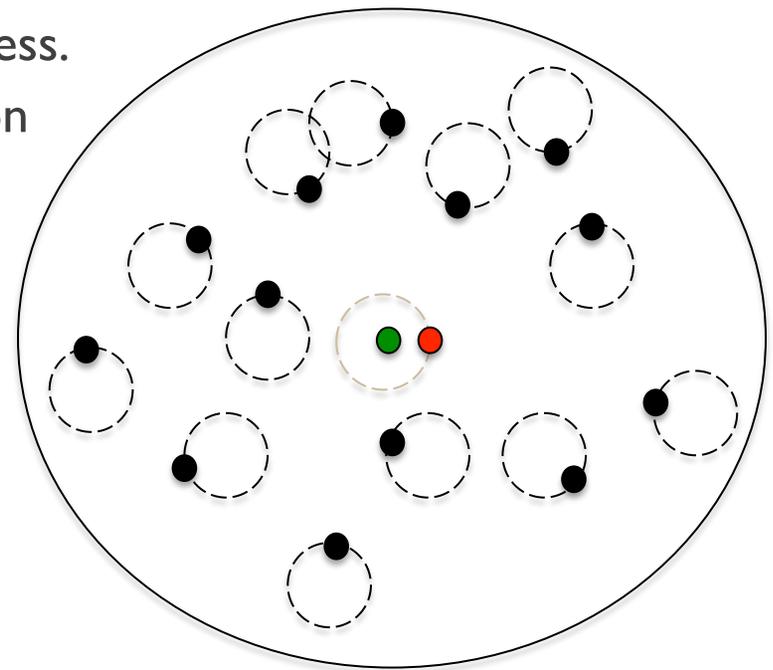
Stochastic Geometry of the Network

- ◆ Can model user location as being drawn from a point process.
 - ★ Poisson Point Process (PPP) or Binomial Point Process (BPP).
- ◆ Actually two processes:
 - ★ One process for **interferers** $\{X_i\}$
 - ★ Another for the **blockages** $\{Y_i\}$
 - ★ The processes are correlated.
- ◆ Analytical approach:
 - ★ Simulation-based: **Simulate** the location, but use the analytical expressions for coverage and rate for each location.
 - ★ Or, make some **approximations** for analytical tractability.



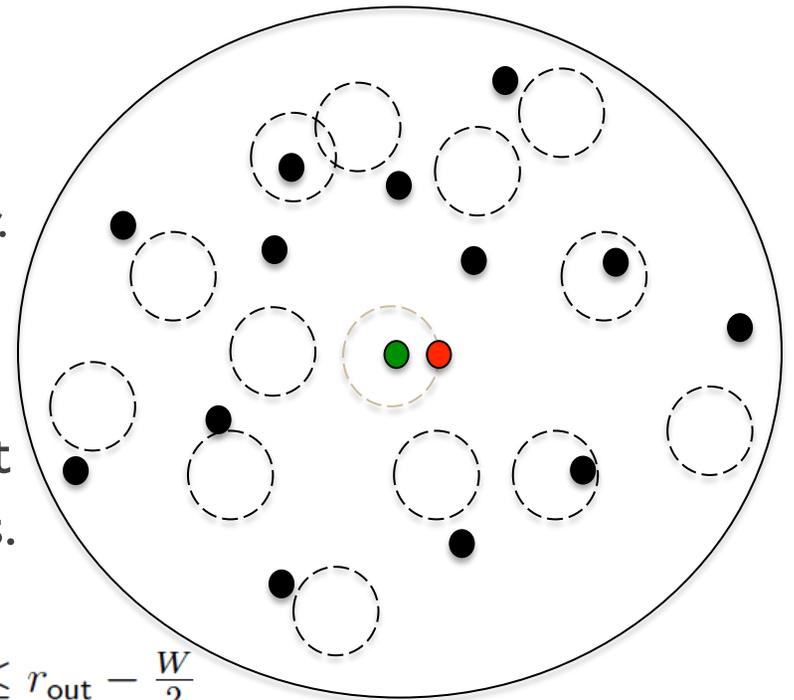
Model I: Orbital Model

- ◆ Orbital model for human body blockage.
 - ✦ Blockage Y_i is drawn from a point process.
 - ✦ Its transmitter X_i is located randomly on the perimeter of a radius-d circle.
 - ✦ Probability of **self-blocking** easily found.
- ◆ Simulation based analysis:
 - ✦ Place each blockage
 - ✦ Randomly locate each interferer
 - ✦ Compute outage probability for each network realization
 - ✦ Repeatedly draw many such networks



Model 2/3: Independent Processes

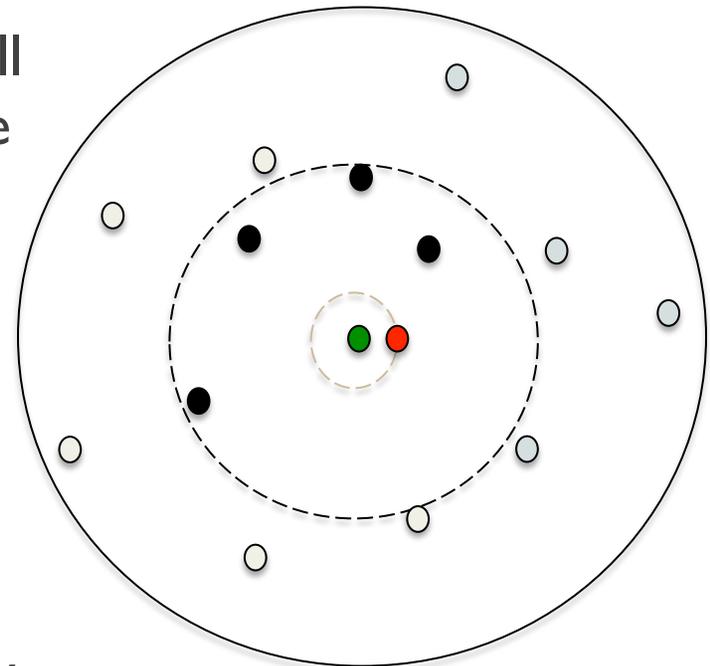
- ◆ Draw the interferers and blockages from independent point processes.
 - ★ Assume interferers must be at least distance r_{in} from the reference receiver.
- ◆ Under this assumption, we can determine the probability of blocking at distance r when there are K interferers.



$$p_b(r) = \begin{cases} 1 - \left(1 - \frac{rW + \frac{\pi W^2}{8} - \mu}{|\mathcal{A}|}\right)^K & \text{if } r_{in} \leq r \leq r_{out} - \frac{W}{2} \\ 1 - \left(1 - \frac{rW - \mu + \nu}{|\mathcal{A}|}\right)^K & \text{if } r_{out} - \frac{W}{2} \leq r \leq r_{out} \end{cases}$$

Model 4: All LOS Interferers are Inside a Ball

- ◆ Since $p_b(r)$ curve is sharp, can assume all interferers within some critical distance R_B are LOS, and outside are NLOS.
- ◆ R_B found as the average blocking distance.
- ◆ Under this model, the analysis is tractable by way of stochastic geometry



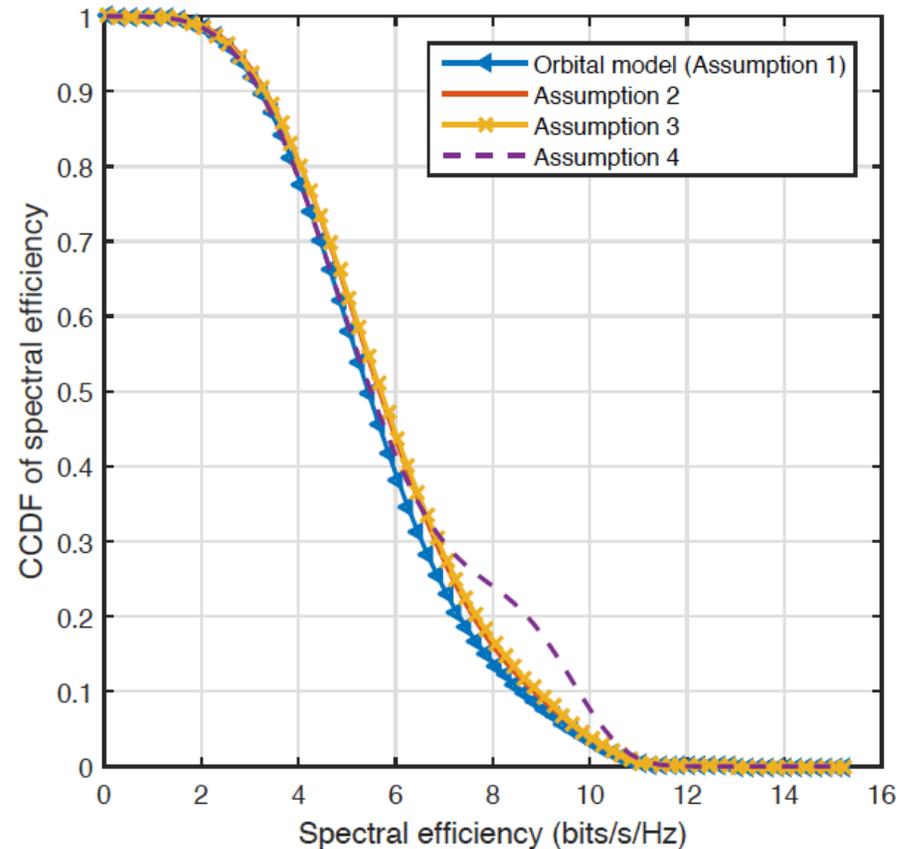
Comparison of Models

◆ Parameters:

- ★ Binomial Point Process
- ★ $K = 36$
- ★ $\sigma^2 = -20$ dB
- ★ $N_t = N_r = 4$
- ★ $p_t = 1$

◆ Models are reasonable

- ★ Overestimates rate.
- ★ LOS ball even more so.



Concluding remarks

- ◆ Human-body blockages should be taken into account at mmWave
 - ✦ Proper stochastic models of blockages and interferers is important
- ◆ Receive antenna configuration and orientation is critical
 - ✦ Users located at a corner can point the antenna away from the “crowd”
- ◆ Future work
 - ✦ Further analysis of random networks and refinement of their models
- ◆ For more information:
 - ✦ K.Venugopal, M.C.Valenti, and R.W. Heath, Jr., “Interference in finite-sized highly dense millimeter wave networks,” in *Proc. Information Theory and Applications (ITA) Workshop*, (San Diego, CA), Feb. 2015



QUESTIONS?