

# Overcoming the Digital Divide by Large-Scale Coverage Analyses for mmWave Cellular Networks

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Christopher R. Anderson, and David J. Love

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**PURDUE**  
UNIVERSITY

**OATS**



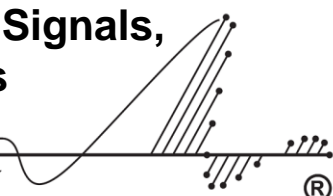
The Internet of Things for Precision Agriculture  
an NSF Engineering Research Center



Asilomar Conference on Signals,  
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IEEE

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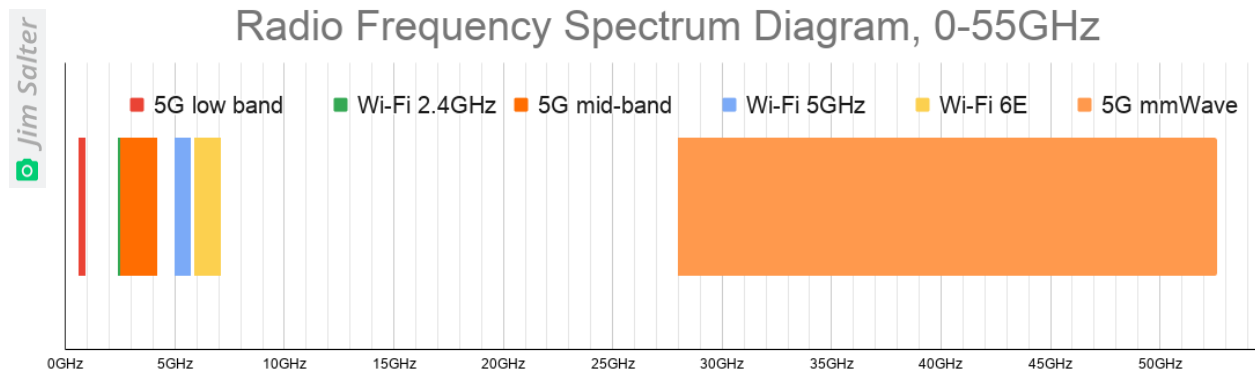


# OVERVIEW

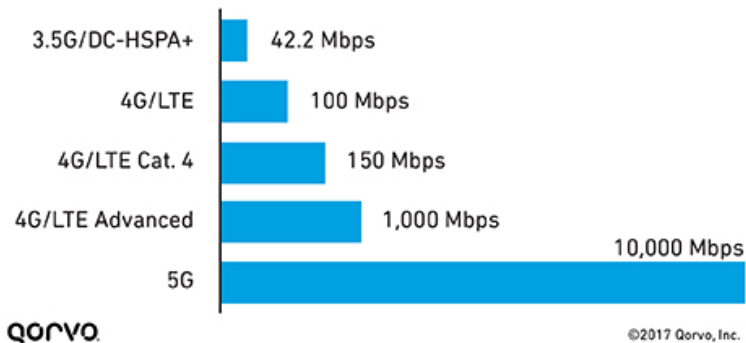
- Millimeter Wave (mmWave) Measurements
  - Extremely sensitive to blockages
- Channel Charting (CC) may be a good fit
  - But there are many new challenges
- Dense network is impractical in near future
  - Especially for ubiquitous coverage in rural areas
- Research Opportunities in Overcoming Digital Divide
  - Site-specific channel modeling & simulation
  - On-demand facility deployment

# BACKGROUND

- Motivations
  - Urban: higher speed & bigger network capacity
    - mmWave: underutilized spectrum resource



## Downlink Speeds by Technical Generation



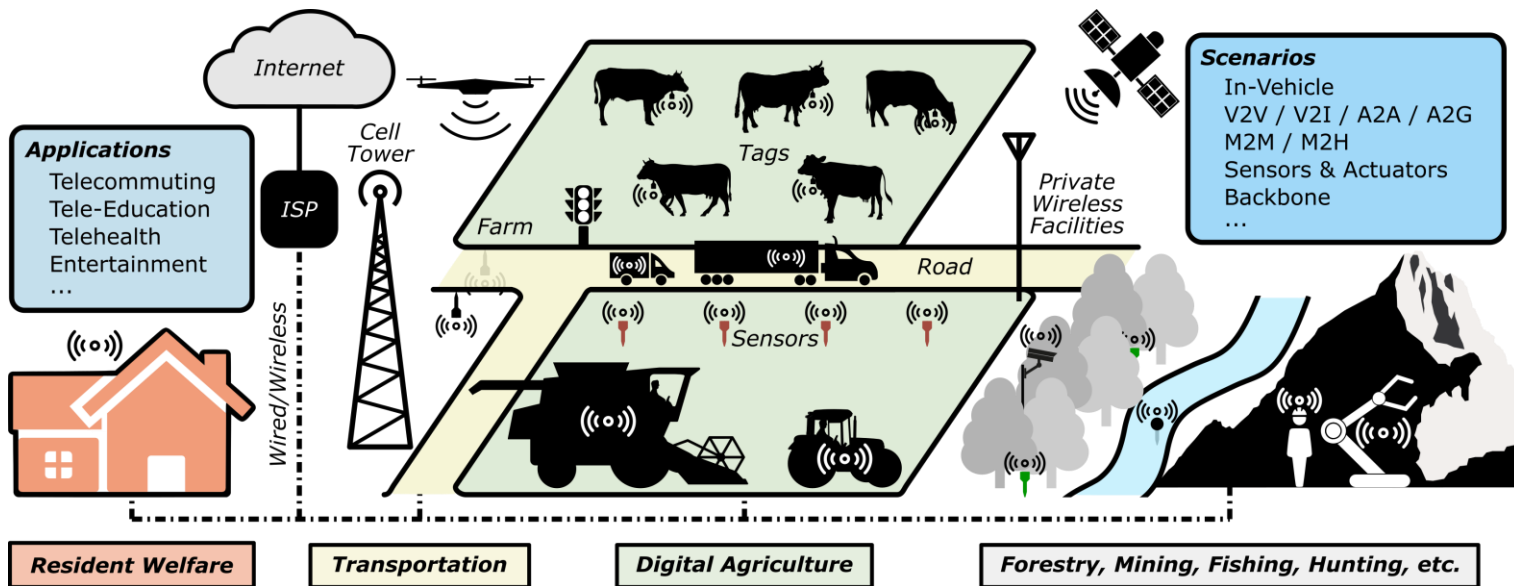
StarDust  
CTG  
GROUP

**100x**

Traffic capacity:  
Driving network hyper-densification  
with more small cells everywhere.

# BACKGROUND

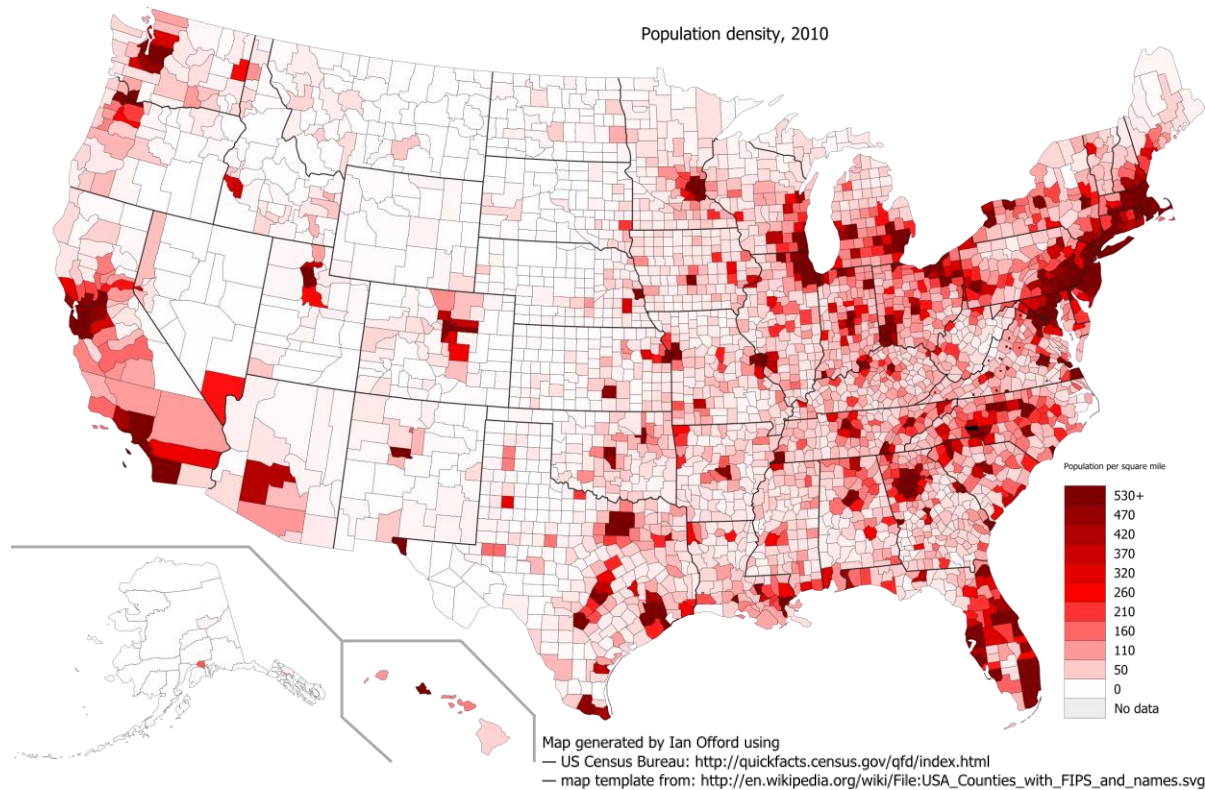
- Motivations
  - Urban: higher speed & bigger network capacity
  - Rural: “ubiquitous” coverage
    - New vision: connecting ~~people~~ things



The illustration is from: Y. Zhang, D. J. Love, J. V. Krogmeier, C. R. Anderson, R. W. Heath and D. R. Buckmaster, "Challenges and Opportunities of Future Rural Wireless Communications," in IEEE Communications Magazine, vol. 59, no. 12, pp. 16-22, December 2021, doi: 10.1109/MCOM.001.2100280.

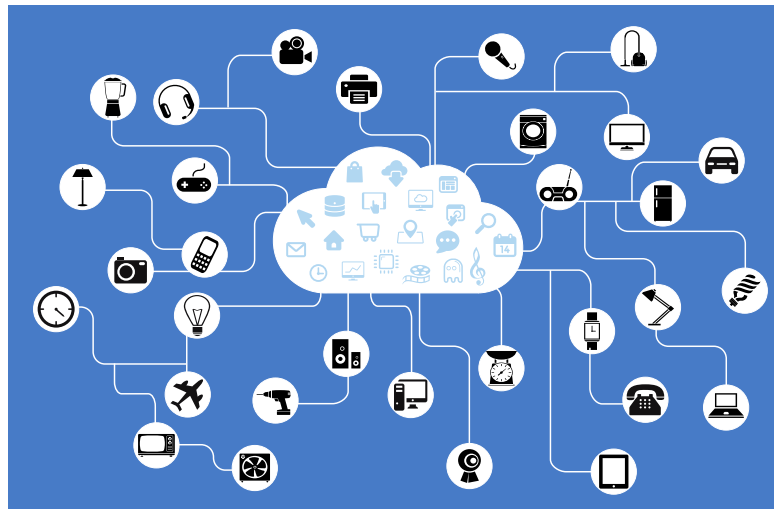
# UBIQUITOUS COVERAGE

- Connecting People => Connecting Things
  - In the U.S., rural regions account for 97% of the land area but only 19.3% of the population.



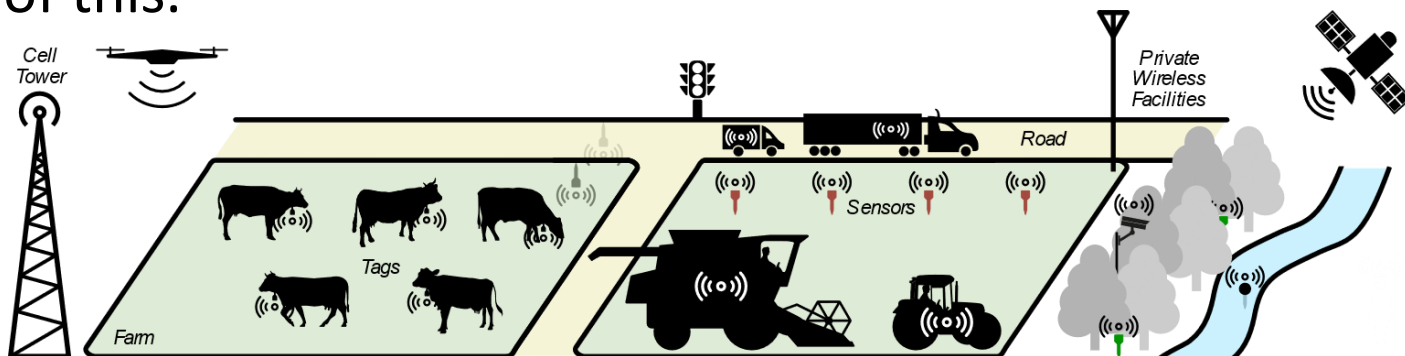
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  - Cisco is anticipating 29.3 billion devices connected to IP networks by the year of 2023, with around half of these connections being machine-to-machine.



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  - In the U.S., digital agriculture could drive an annual additional gross benefit of US\$47–65 billion, and rural broadband connectivity could contribute over one-third of this.



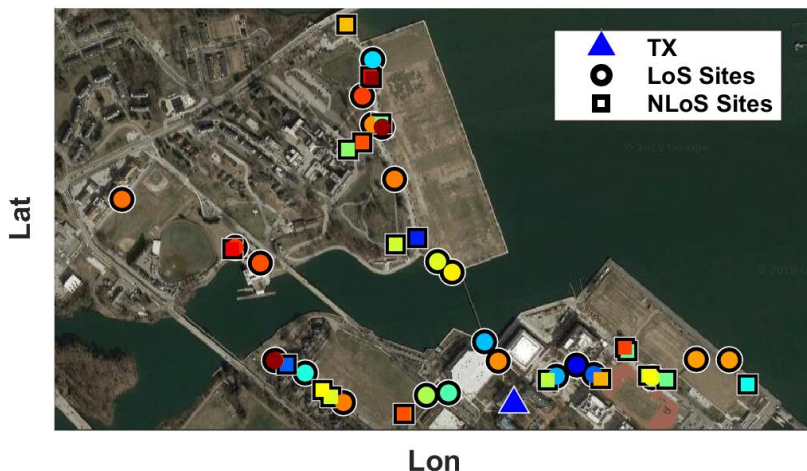
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  - In the U.S., digital agriculture could drive an annual additional gross benefit of US\$47–65 billion, and rural broadband connectivity could contribute over one-third of this.
  - 49% of U.S. car crash fatalities in 2015 occurred in rural regions. Wireless connectivity could reduce these fatalities by 80%.

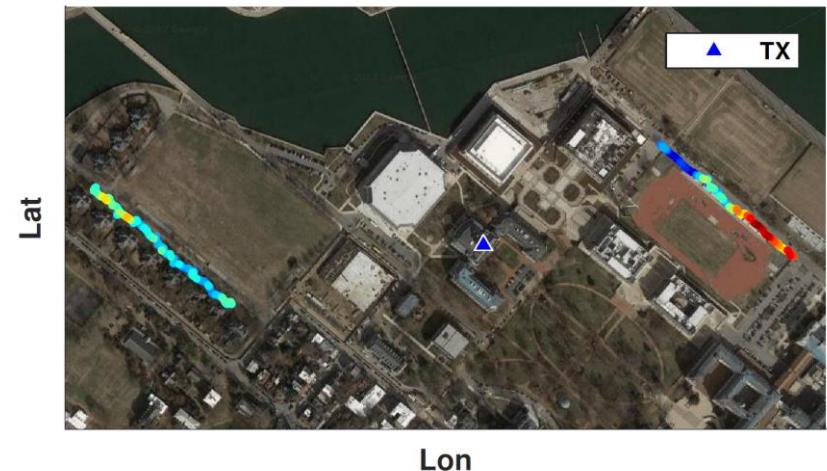


# EFFECTS OF LOCAL BLOCKAGES

- Suburban Measurement Campaign @ 28GHz
  - At United State Naval Academy (USNA)
  - 50 individual sites + 2 continuous tracks
  - Basic Transmission Losses in decibel (dB)



(a) Overview for the basic transmission losses of all 50 individual sites



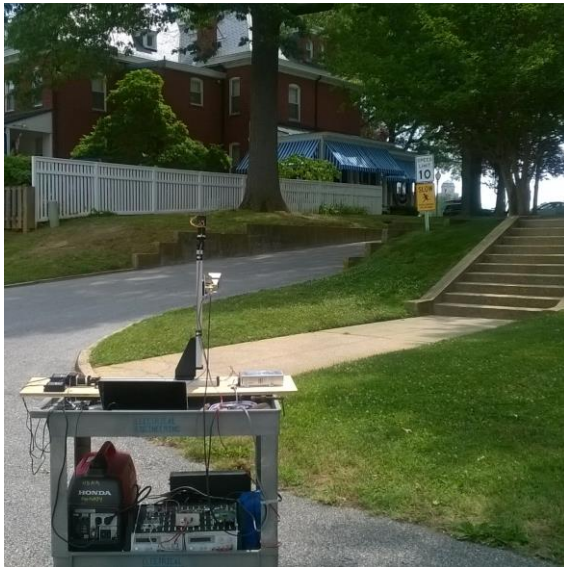
(b) Overview for the basic transmission losses of the two continuous tracks

# MEASUREMENT SETUP

(a) RX on an electric car



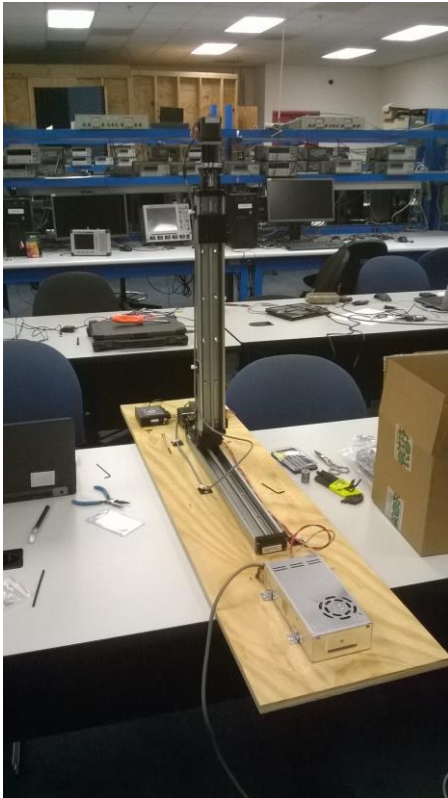
(b) RX on a trolley



(c) Before a continuous signal recording for a pedestrian path

# EFFECTS OF LOCAL BLOCKAGES

- A custom-designed positioning system
  - Receiver (RX) scanned over a “+” pattern



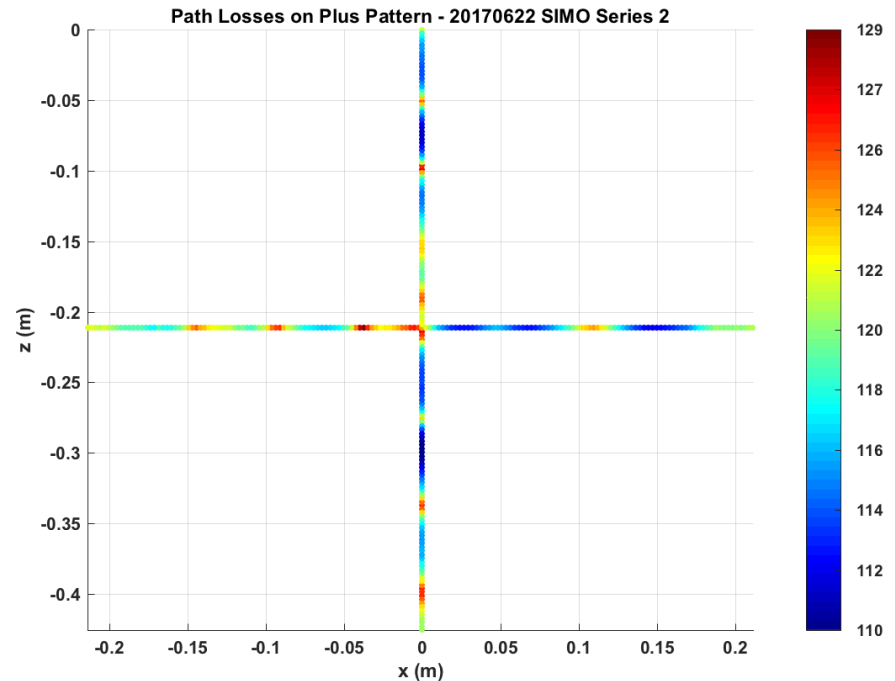
(a) Under development



(b) Under deployment at RX

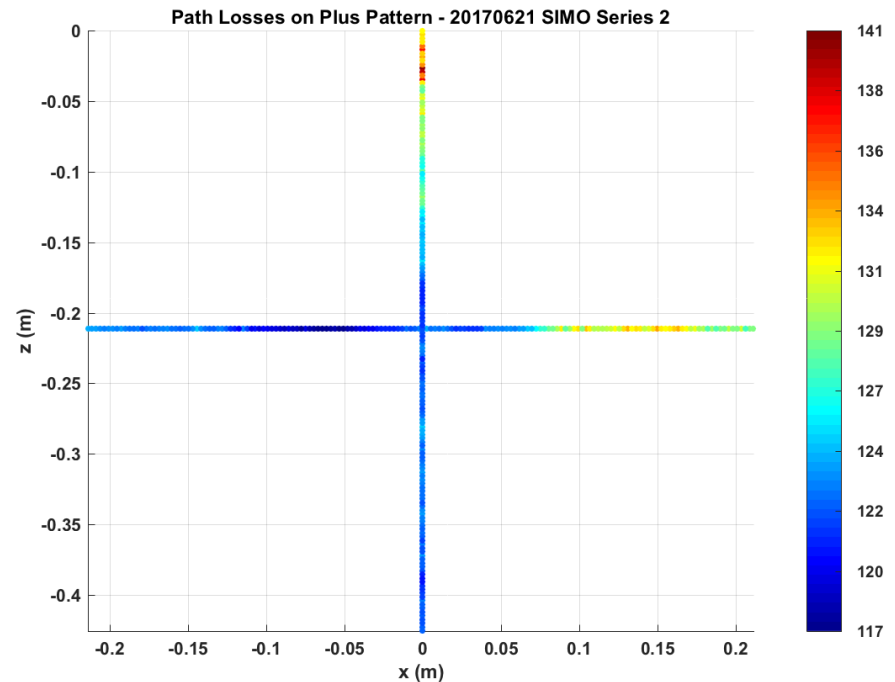
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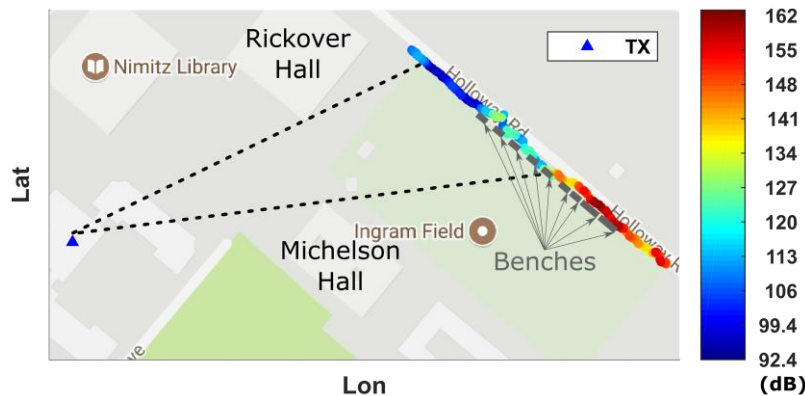
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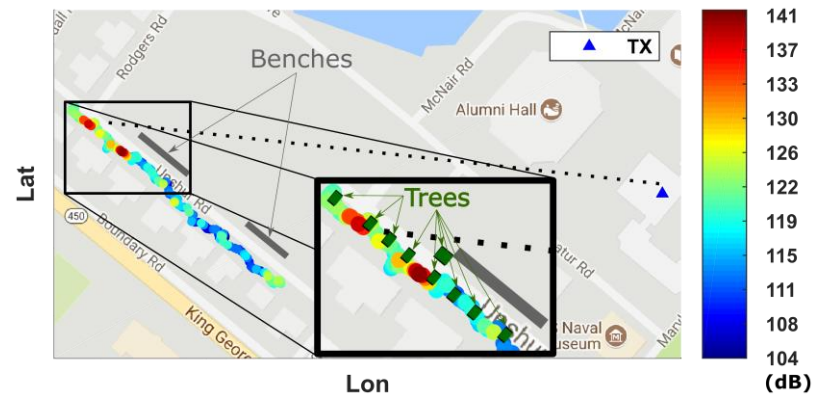


# EFFECTS OF LOCAL BLOCKAGES

- Blockage happens “everywhere”
- The influence is huge
  - Bleacher: 19 dB => ~79.4 fold
  - Tree: 24 dB => ~251.2 fold



(a) Track on Holloway Road



(b) Track on Upshur Road

# DISCUSSION

- High sensitivity on local blockages is an issue
    - Frequent high-accuracy location information is needed for optimizing resource management
  - Channel Charting (CC) may be useful
    - Self-supervising
    - Geographical information not required
  - But there are more challenges
    - High-dimension “latent” space
    - Requirements on precision and accuracy
- => Semi-supervised learning with geo info?

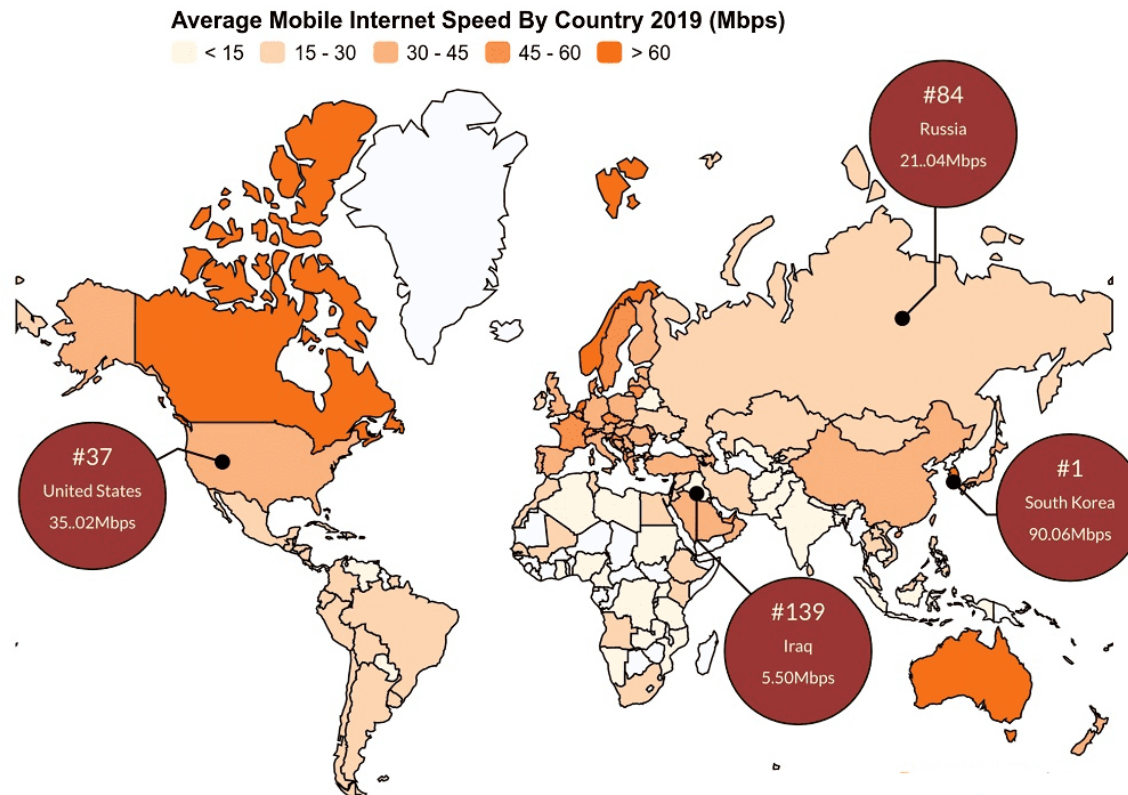
# DISCUSSION

- High sensitivity on local blockages is an issue
  - Frequent high-accuracy location information is needed for optimizing resource management
- Broad application of mmWave may further broaden the digital divide



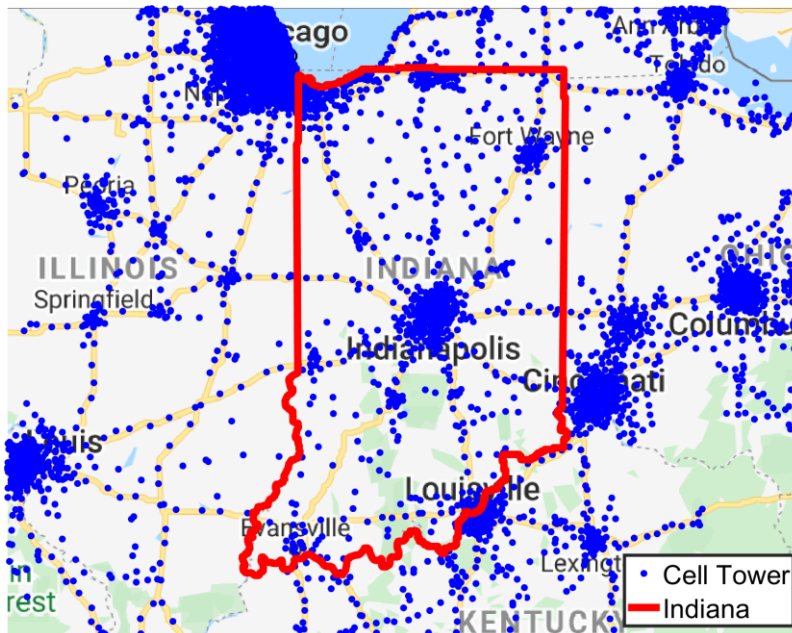
# DIGITAL DIVIDE

- Communication infrastructure deployed in rural areas lags its urban counterparts
  - Throughout the world

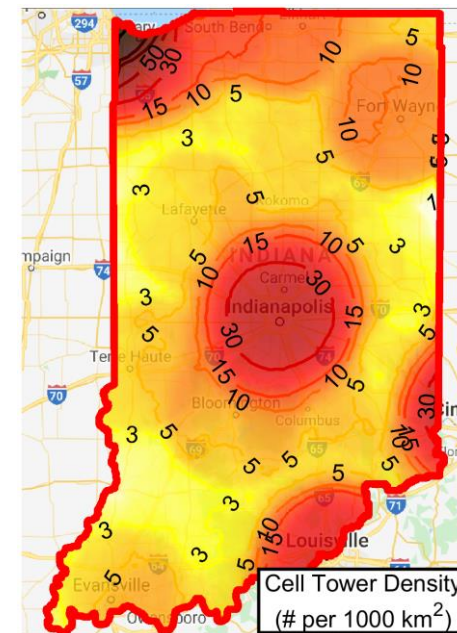


# DIGITAL DIVIDE

- Communication infrastructure deployed in rural areas lags its urban counterparts
  - Throughout the world
  - Network operators prioritize urban tower density



(a) Tower laydown of one national carrier

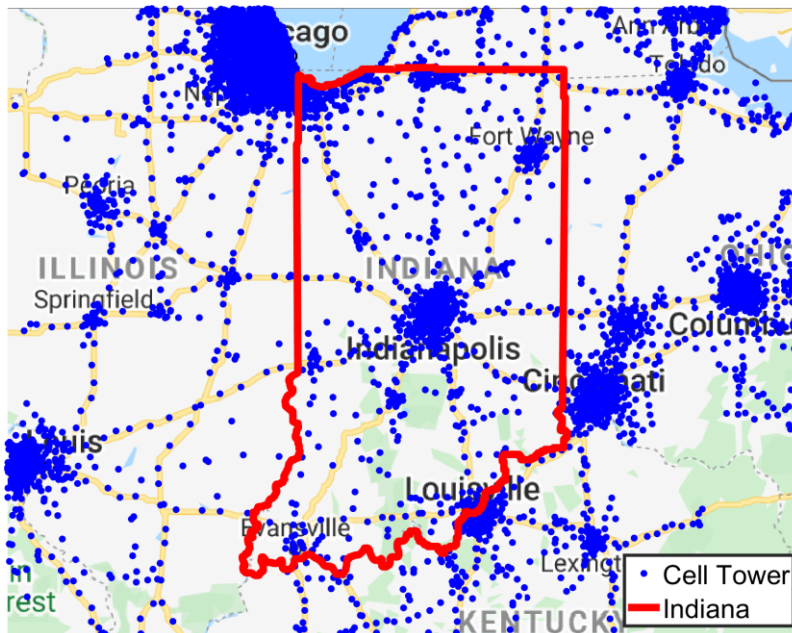


(b) Tower density

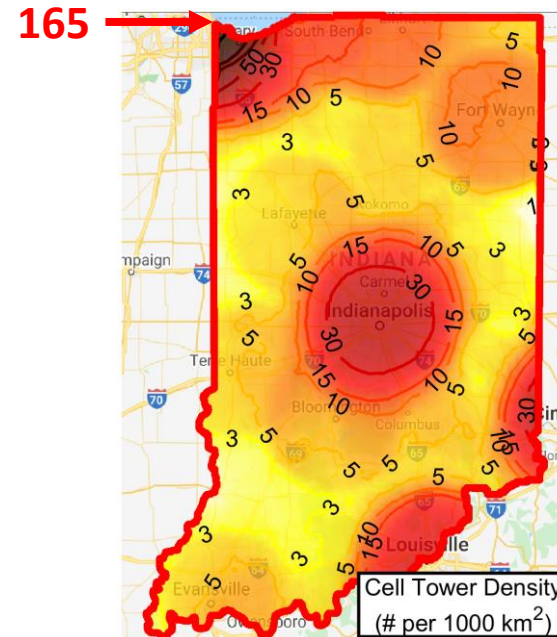
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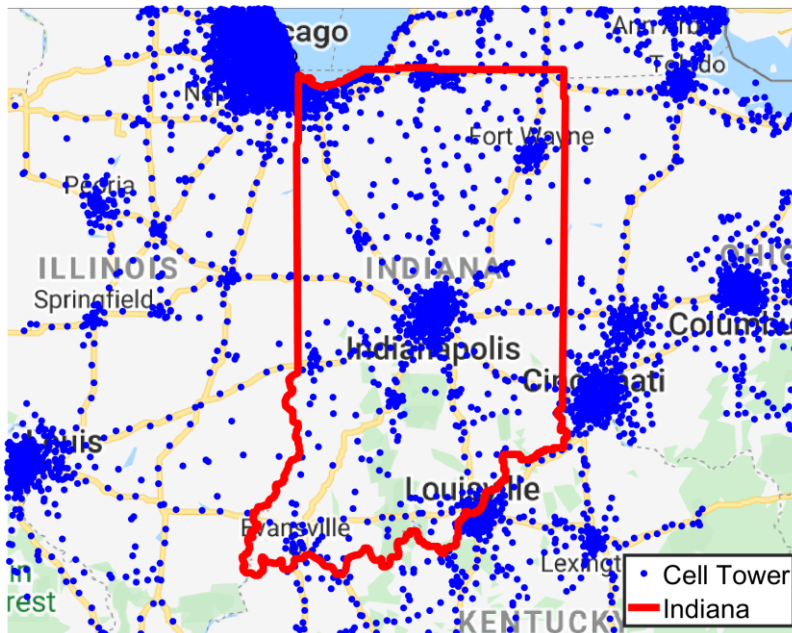


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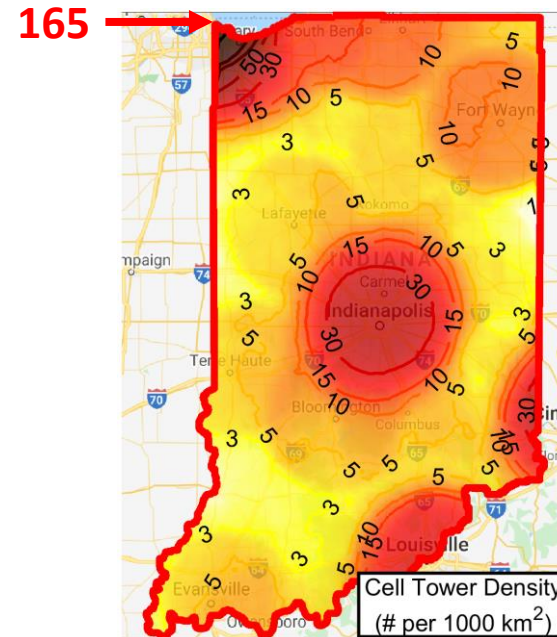
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(b) Tower density **70.5% area: <10**  
**44.5% area: <5**

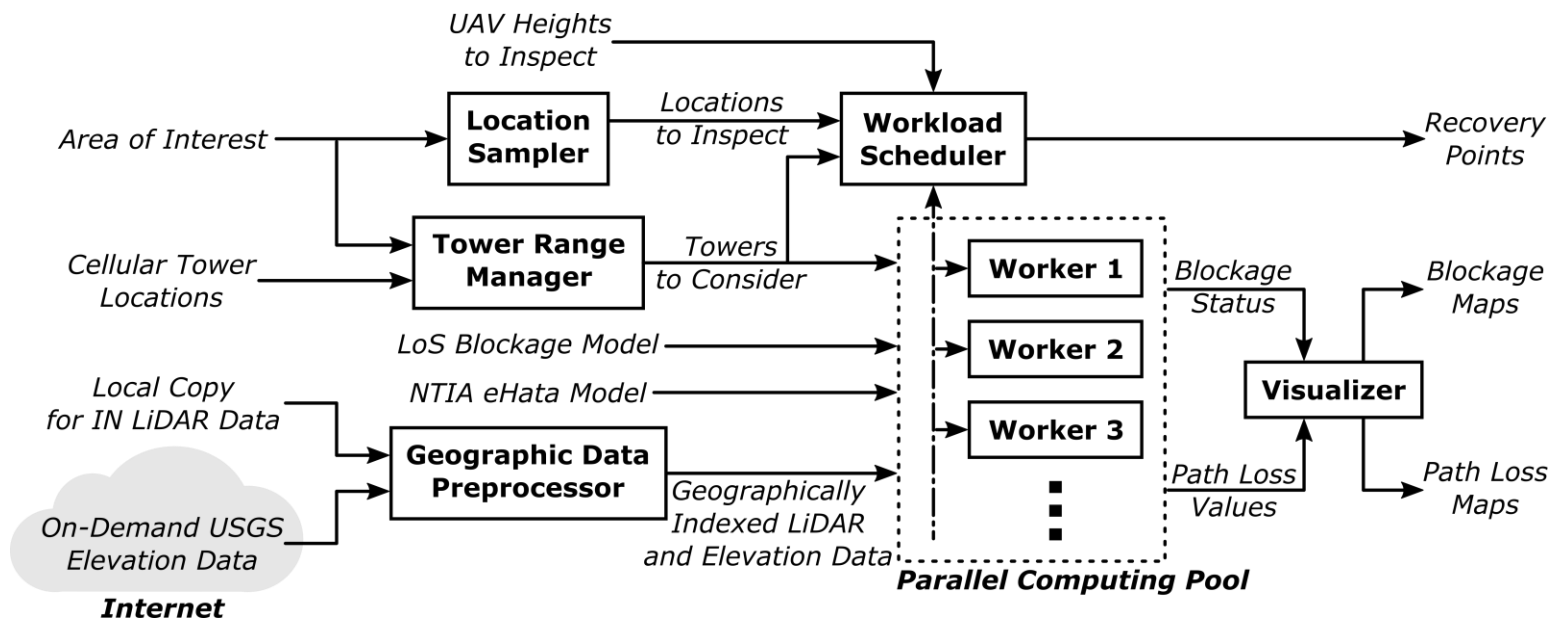
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  - mmWave will broaden the gap

# LARGE-SCALE COVERAGE ANALYSES

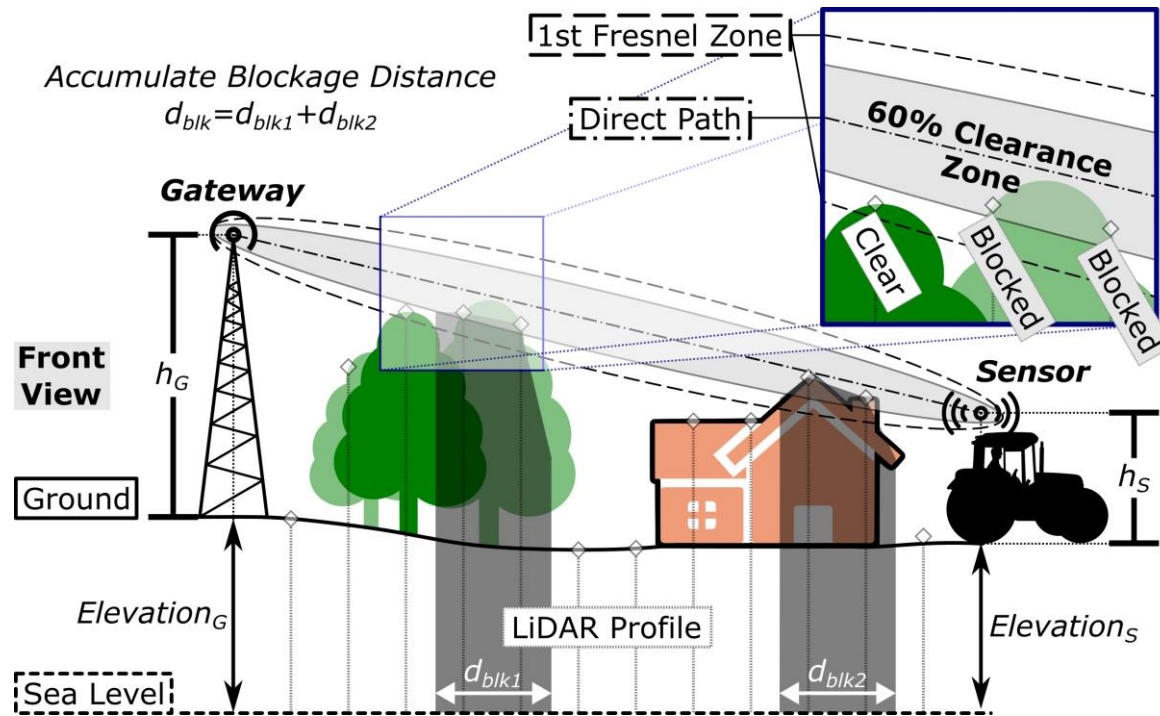
- Site-Specific Channel Modeling & Simulation
  - Cumulative blockage distance
  - Path loss



More details on the simulator implementation can be found in: Y. Zhang, T. Arakawa, J. V. Krogmeier, C. R. Anderson, D. J. Love and D. R. Buckmaster, "Large-Scale Cellular Coverage Analyses for UAV Data Relay via Channel Modeling," ICC 2020 - 2020 IEEE International Conference on Communications (ICC), 2020, pp. 1-6, doi: 10.1109/ICC40277.2020.9149403.

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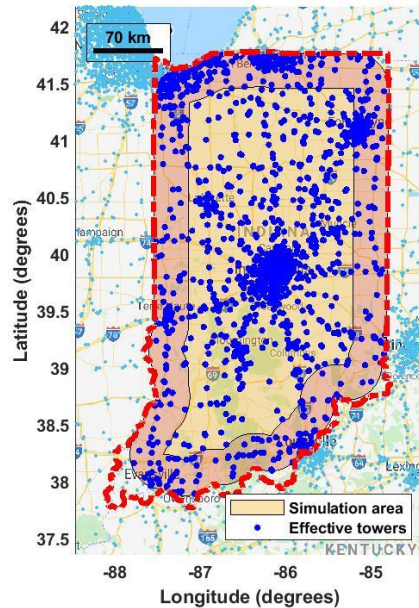
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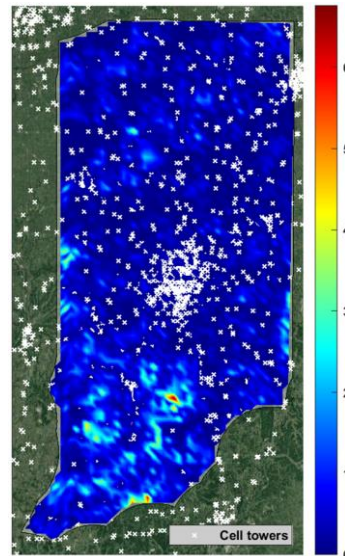
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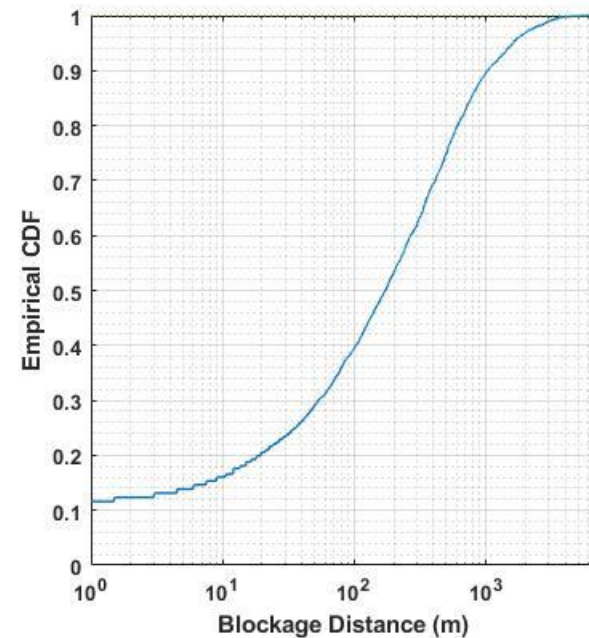
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(a) Overview



(b) Best available blockage distance



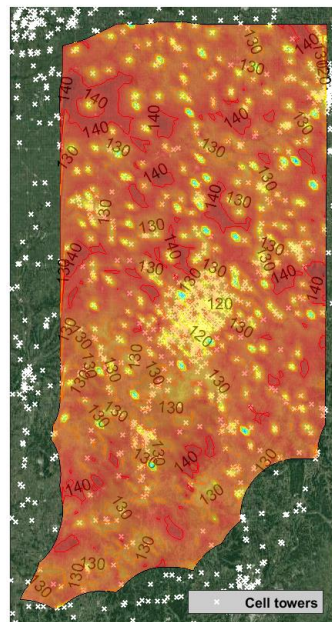
(c) Distribution



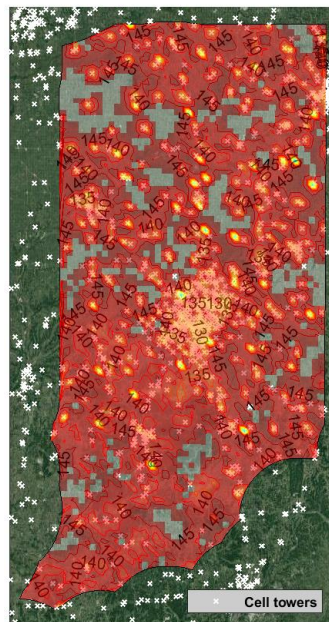
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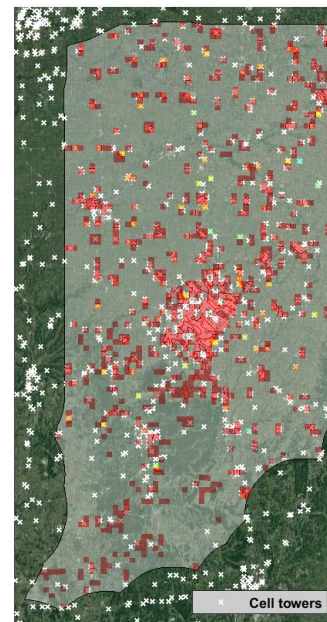
Max. allowed path loss = 150 dB



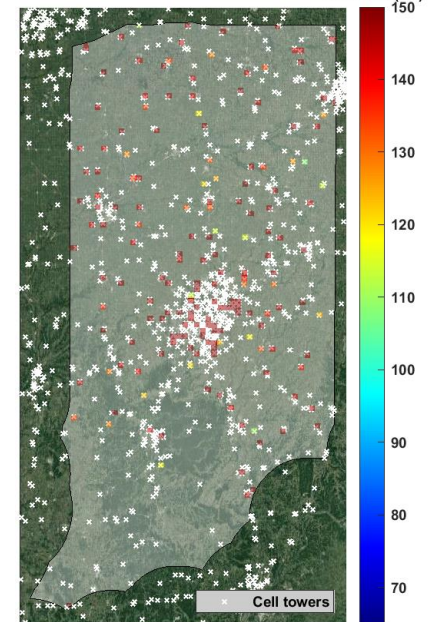
(a) 1900 MHz



(b) 4700 MHz



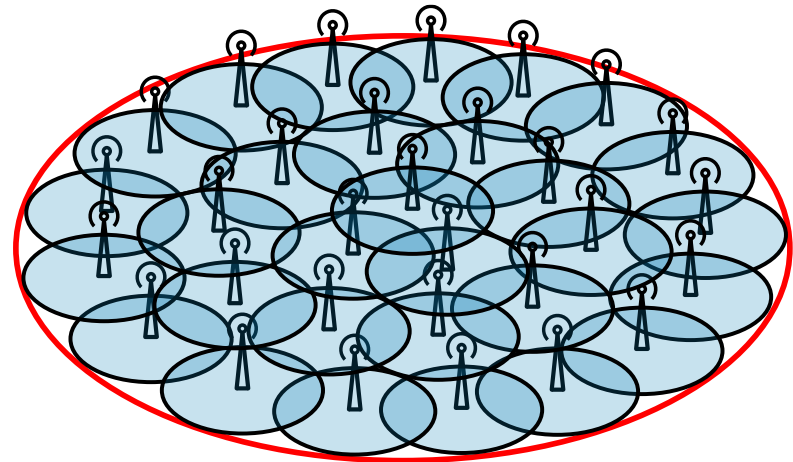
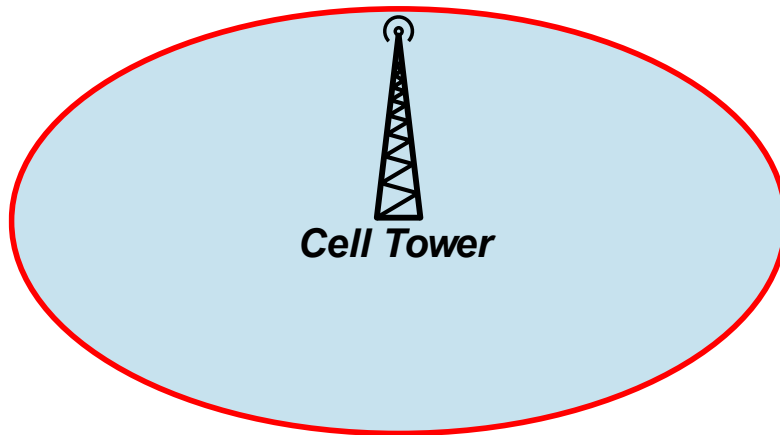
(c) 13 GHz



(d) 28 GHz

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IN Area (km <sup>2</sup> )	Sim. Area (km <sup>2</sup> )	Carrier Freq. (MHz)	Max. Allowed Loss (dB)	Covered Area (km <sup>2</sup> )	Max. Cell Radius (km)	Max. Cell Area (km <sup>2</sup> )	Min. # of New Towers Needed	# of Existing Towers
94,321	52,348	1900	150*	52,348	2.44	18.7	0	819
		3700		51,044	1.49	7.0	187	
		4700		47,159	1.25	4.9	1064	
		7000		34,187	0.98	3.0	6029	
		13,000		10,312	0.86	2.3	18,062	
		28,000		2291	0.69	1.5	32,988	

\* The typical max. allowed path loss for LTE systems is 140 dB: Y. Zhang, T. Arakawa, J. V. Krogmeier, C. R. Anderson, D. J. Love and D. R. Buckmaster, "Large-Scale Cellular Coverage Analyses for UAV Data Relay via Channel Modeling," ICC 2020 - 2020 IEEE International Conference on Communications (ICC), 2020, pp. 1-6, doi: 10.1109/ICC40277.2020.9149403.

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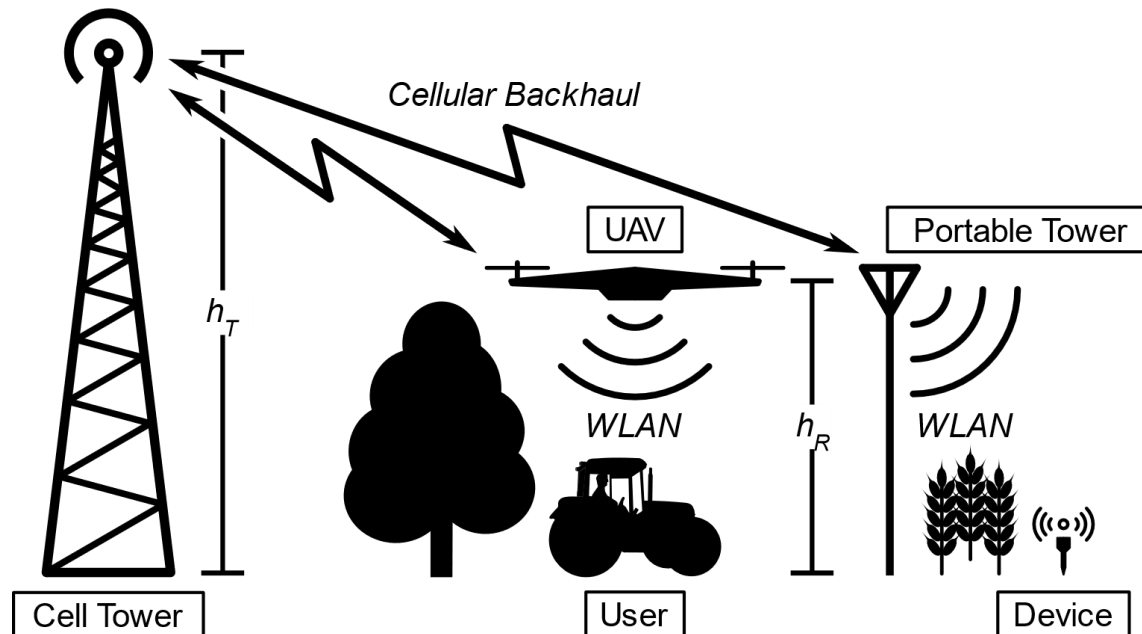
x US\$200,000–250,000/tower

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# DIGITAL DIVIDE

- Key Rural Wireless Communications Characteristic to Take Advantage of...
  - Temporary Coverage
    - => On-demand Facility Deployment



# SUMMARY

- Millimeter Wave (mmWave)
  - Extremely sensitive to blockages
- Channel Charting (CC)
  - Advantage: Unsupervised learning
  - New challenge: Higher precision required
- Dense network is impractical in near future
  - Especially for ubiquitous coverage in rural areas
  - Potential solutions
    - Site-specific channel modeling & simulation
    - On-demand facility deployment



# Thank you!

Sponsorship for this work was provided by the Foundation for Food and Agriculture Research (FFAR) under Award 534662, and the NSF under grants CNS-1642982 and EEC-1941529.

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