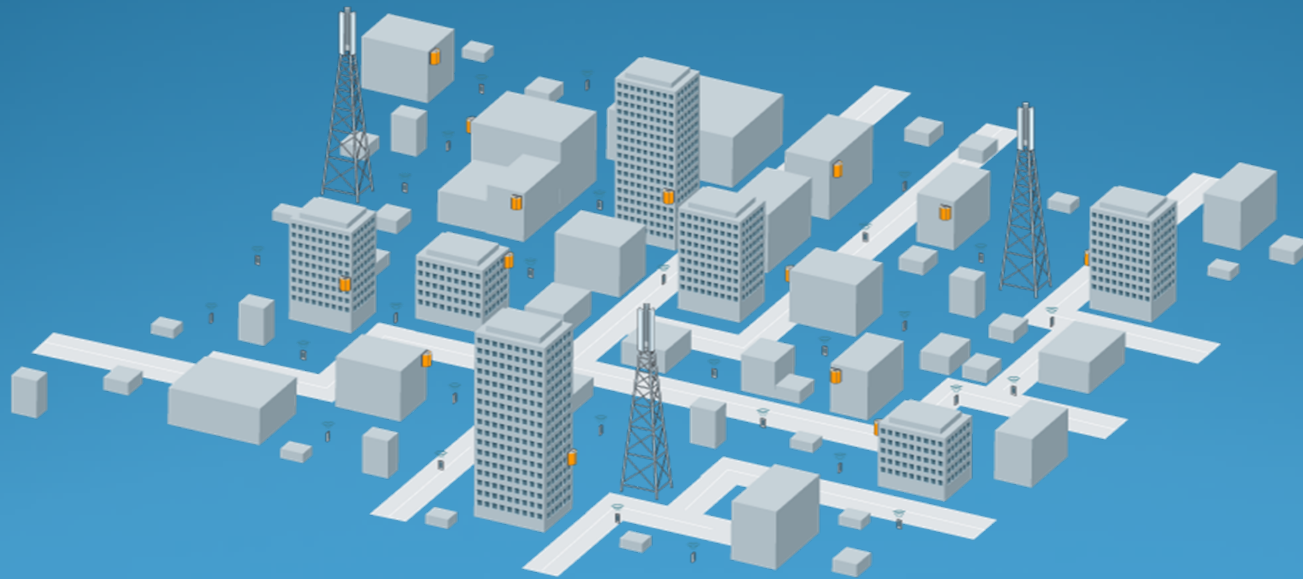


# The future of wireless and what it will enable

***Andrea Goldsmith***

***Stanford University***

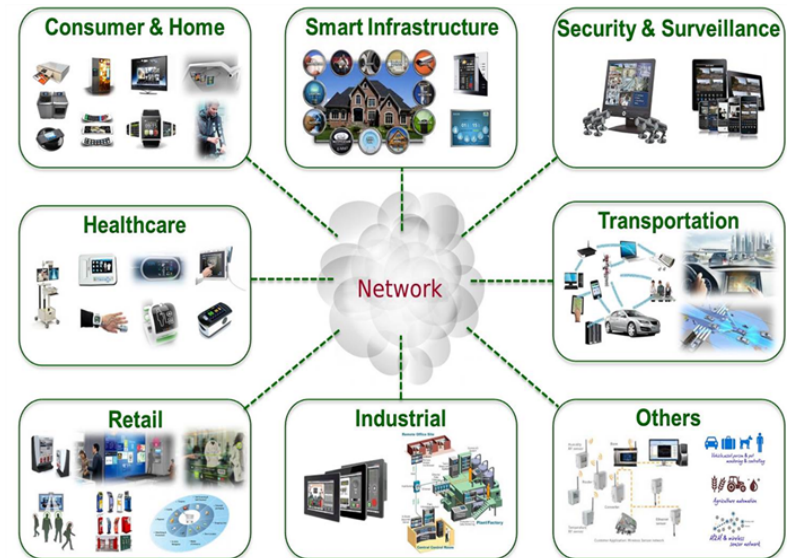
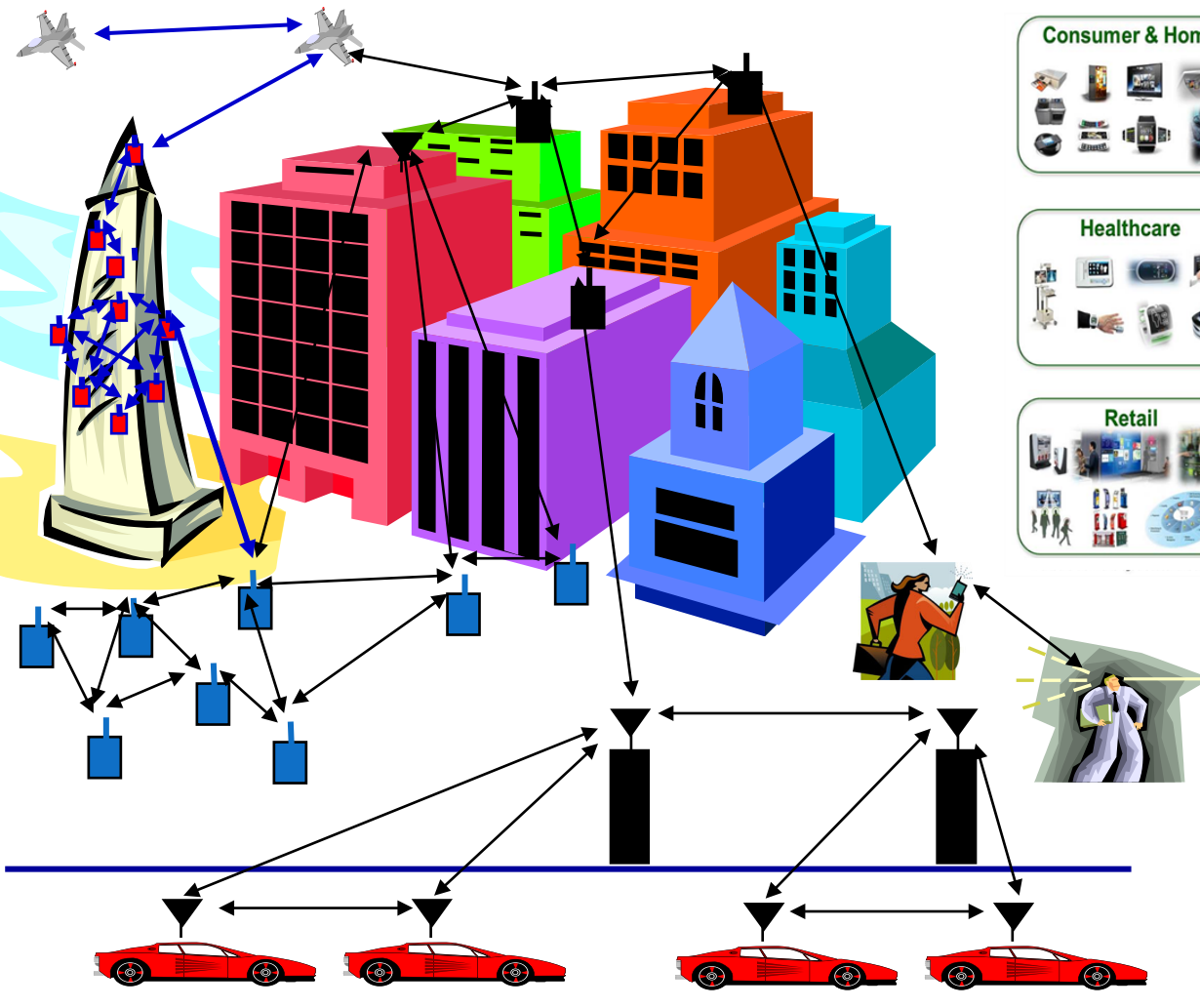


Visions for Future Communications Summit  
Lisbon, Portugal  
October 23, 2017



# Future Wireless Networks

*Ubiquitous Communication Among People and Devices*



Next-Gen Cellular/WiFi  
Smart Homes/Spaces  
Autonomous Cars  
Smart Cities  
Body-Area Networks  
Internet of Things  
All this and more ...

# The Licensed Airwaves are “Full”

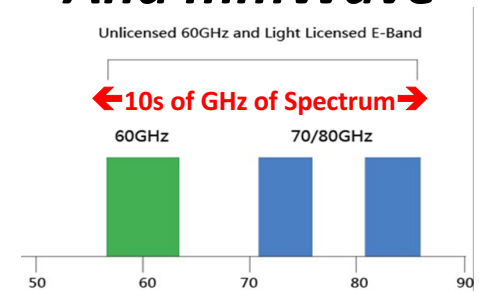


Source: FCC

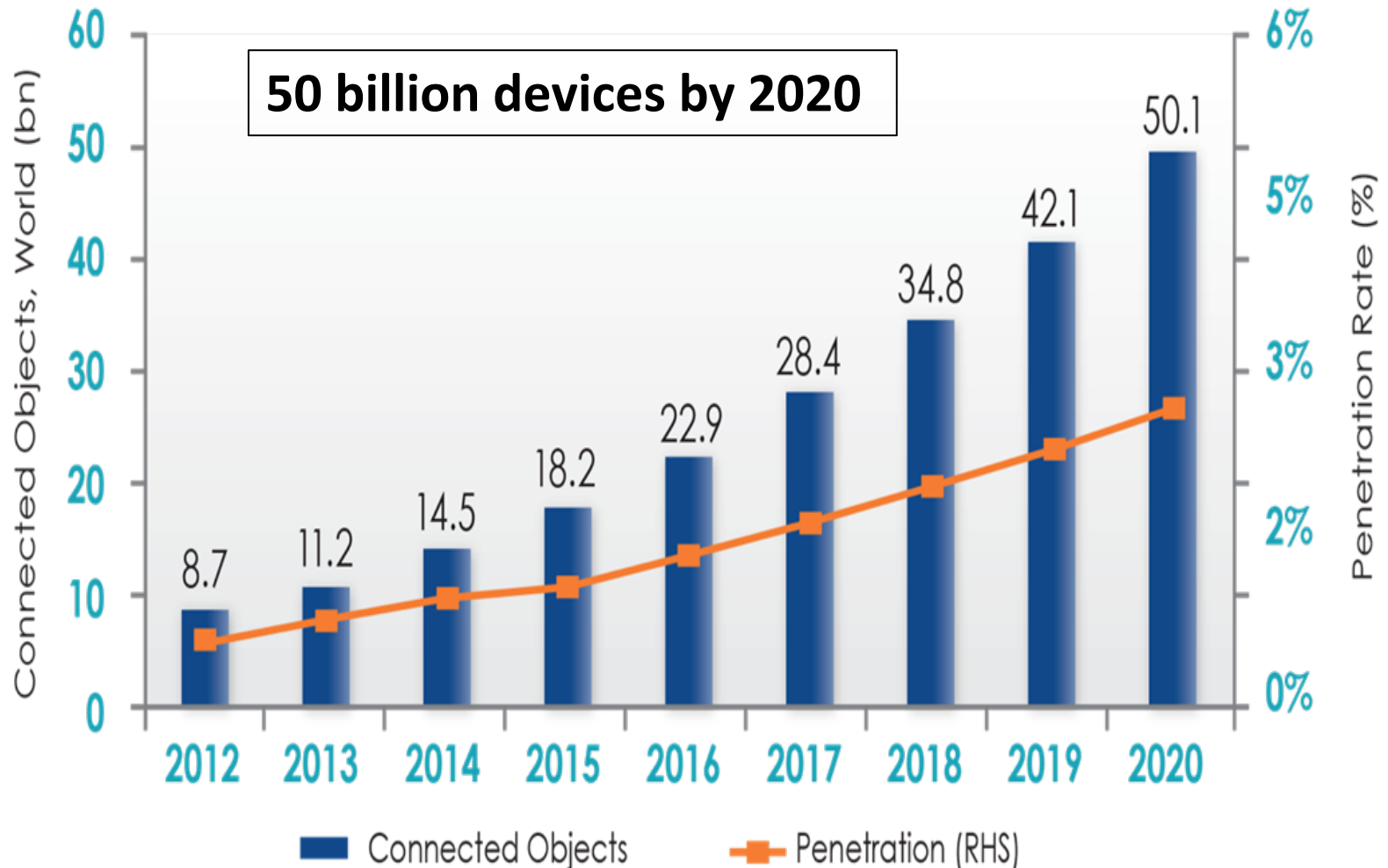
*Also have Wifi*



*And mmWave*



# On the horizon, the Internet of Things



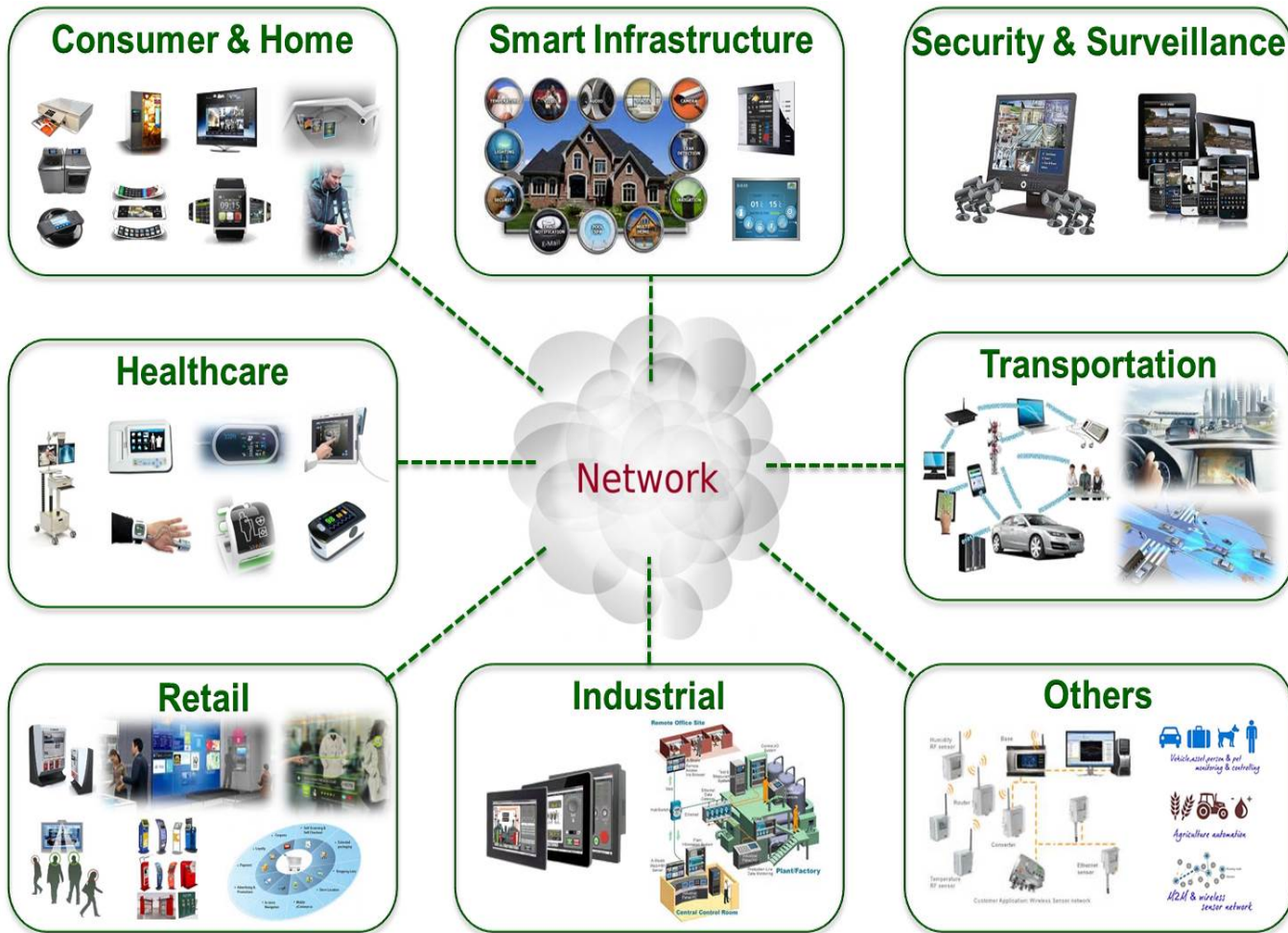


# What is the Internet of Things:

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Different requirements than smartphones: **low rates/energy consumption**



# Are we at the Shannon capacity of wireless systems?

**We don't know the Shannon capacity of most wireless channels**

- Channels without models: molecular, mmW, THz
- Time-varying channels.
- Channels with interference or relays.
- Cellular systems
- Ad-hoc and sensor networks
- Channels with delay/energy/\$\$\$ constraints.

***Shannon theory provides design insights and system performance upper bounds***

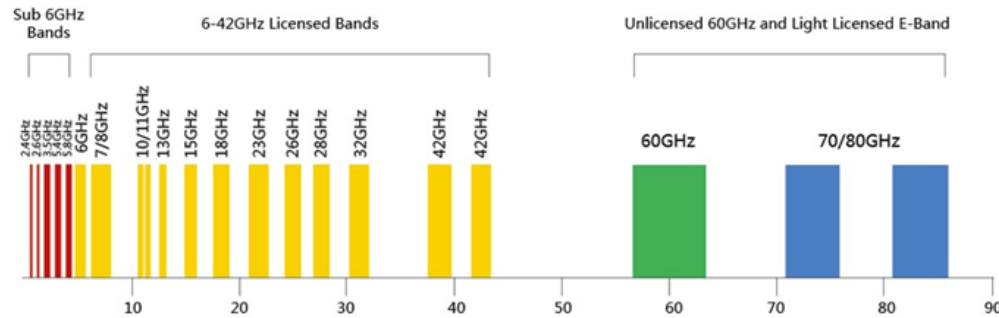


# Enablers for Increasing Wireless Data Rates

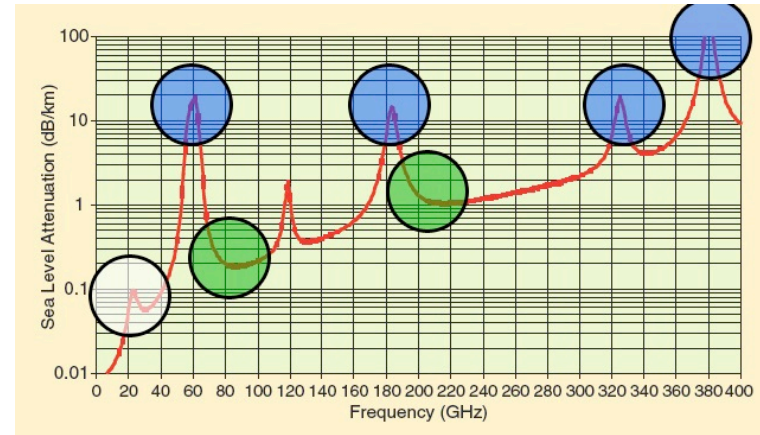
- Utilizing more spectrum (mmWave)
- (Massive) MIMO
- Rethinking cellular system design
- Software-defined wireless networking
- “Smarter” and more agile (cognitive) radios

# mmWave enables high data rates

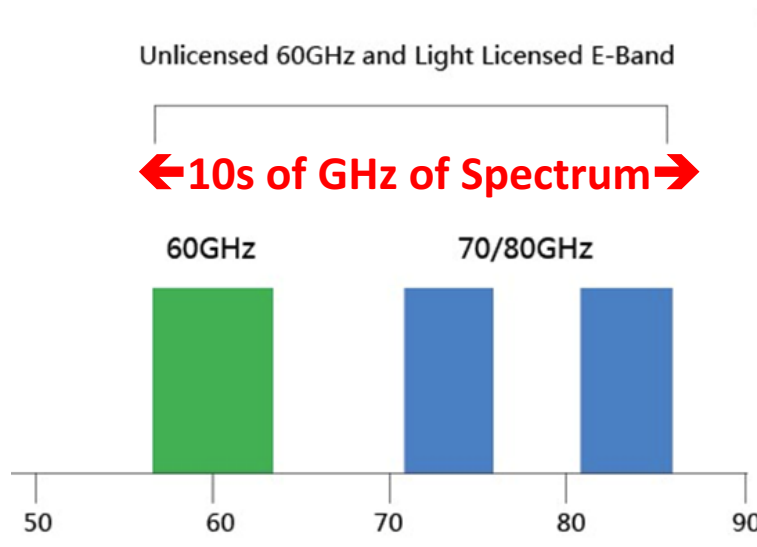
- Large BW allocations
  - 10s of GHz
  - In the 60-120 GHz bands



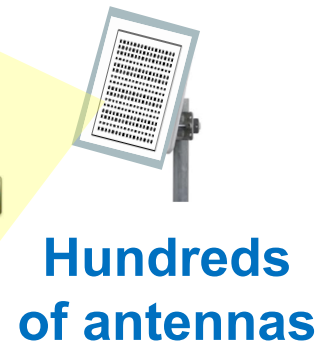
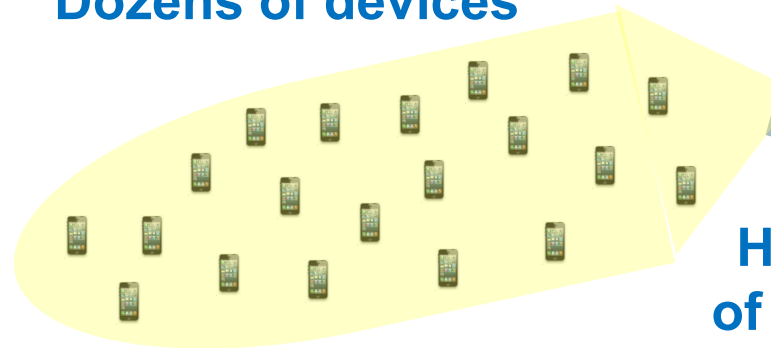
- Small form factor
  - Small signal wavelengths
  - Inter-antenna spacing small  $\Rightarrow$  smaller arrays
- Challenges:
  - Attenuation (not monotonic in  $f$ )
  - Propagation poorly understood
    - Path loss, shadowing, multipath
  - Channel estimation



# mmWave Massive MIMO



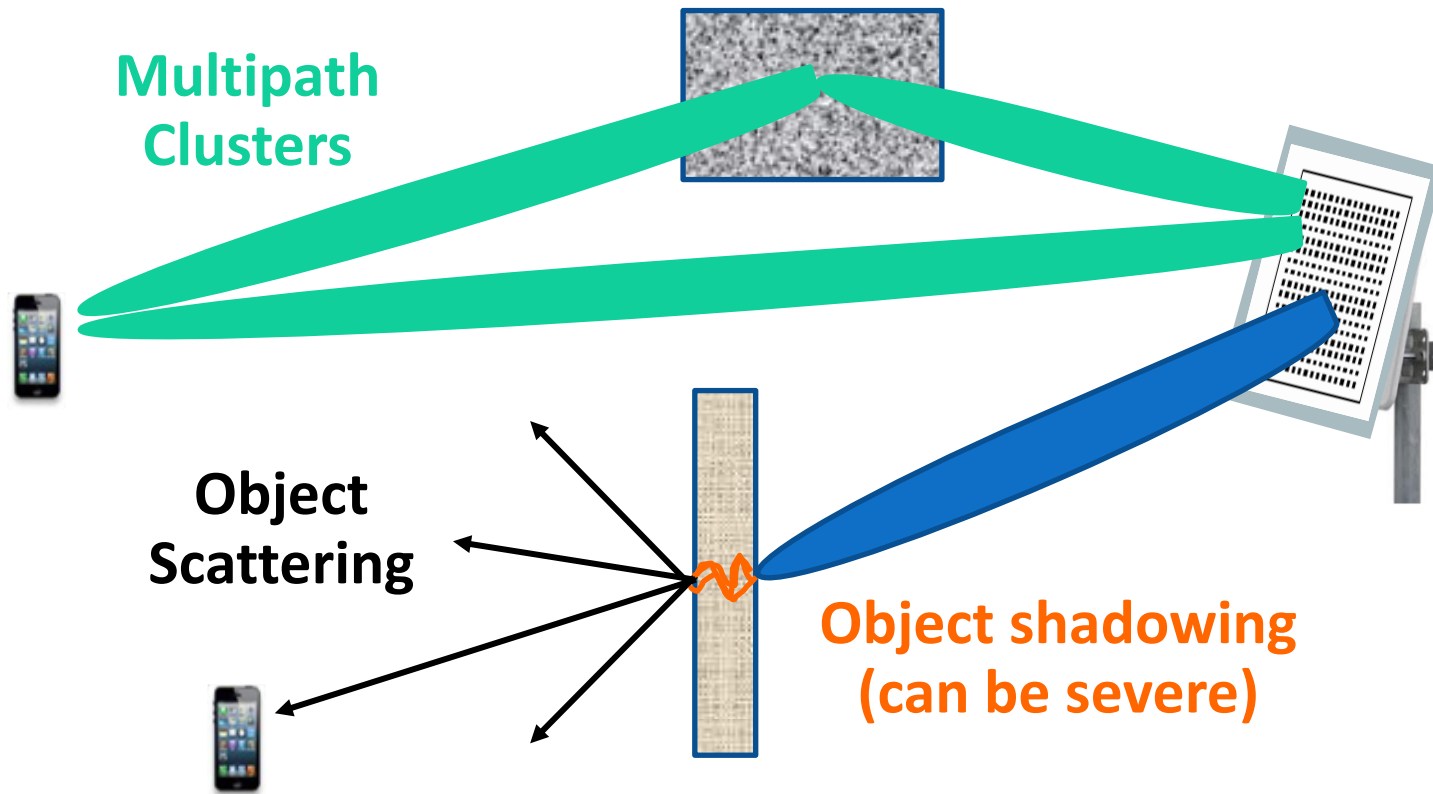
Dozens of devices



Hundreds of antennas

- mmWaves have large attenuation and path loss
- For asymptotically large arrays with channel state information, no attenuation, fading, interference or noise
- mmWave antennas are small: perfect for massive MIMO
- Bottlenecks: channel estimation, complexity, propagation
- Non-coherent design holds significant promise

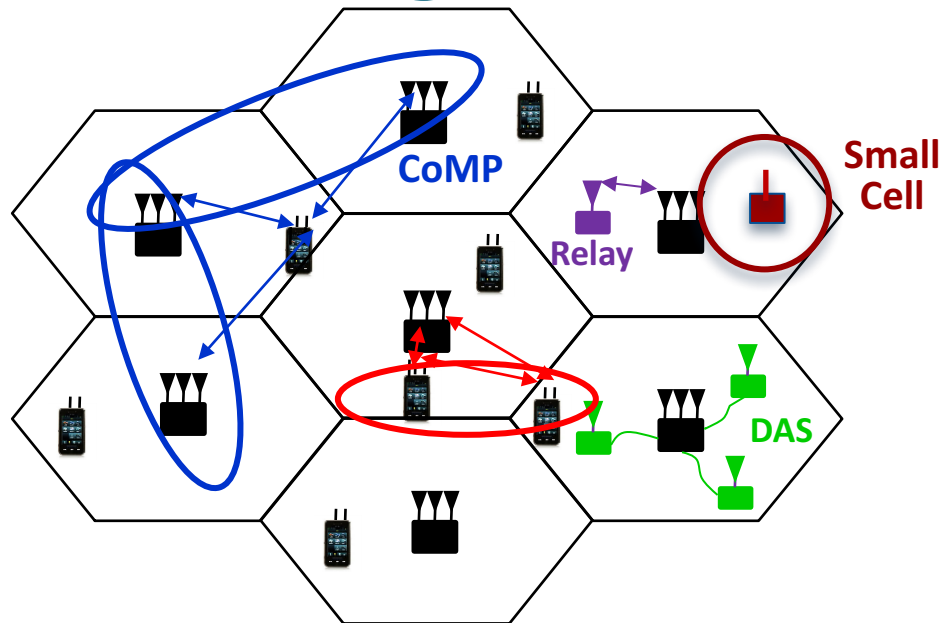
# Multipath and Shadowing under Beamsteering



- Propagation different than in current systems; not well understood
- New beamsteering techniques that incorporate propagation needed



# Rethinking Cellular System Design



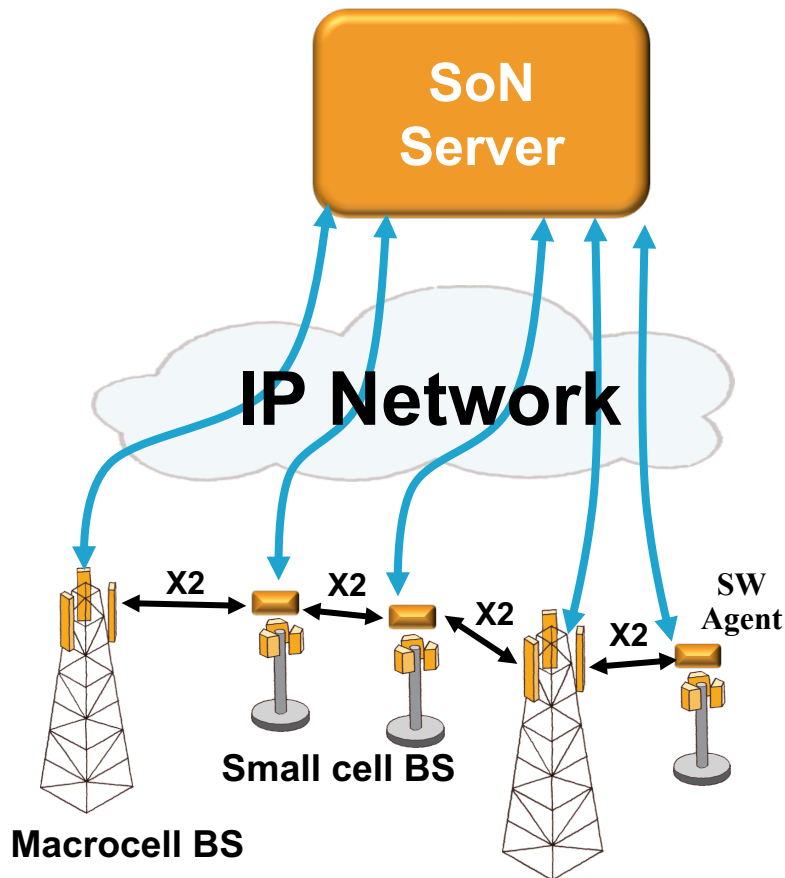
*How should cellular systems be designed?*


*Will gains be big or incremental; in capacity, coverage or energy?*

- Cellular systems reuse channels/timeslots in different cells
  - Traditional design assumes system is “interference-limited”
  - Capacity unknown; upper bound based on BC/MAC with pooled antennas
- No longer the case with recent technology advances:
  - MIMO, multiuser detection, cooperating BSs (CoMP) and relays
  - Raises interesting questions such as “what is a cell?”
- Dynamic self-organization (SoN) needed for deployment and optimization

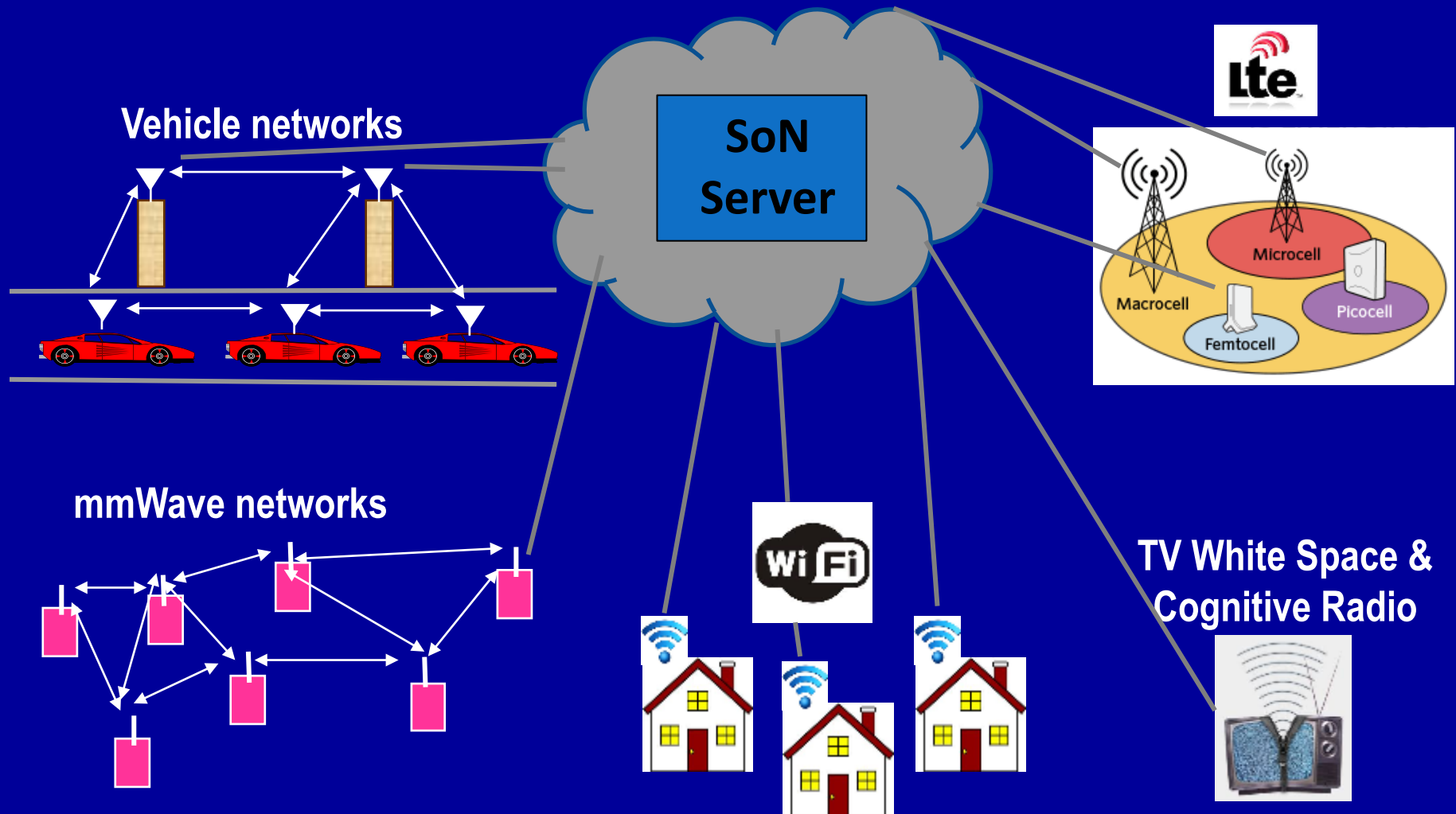
# Small cells are the solution to increasing cellular system capacity

In theory, provide exponential capacity gain

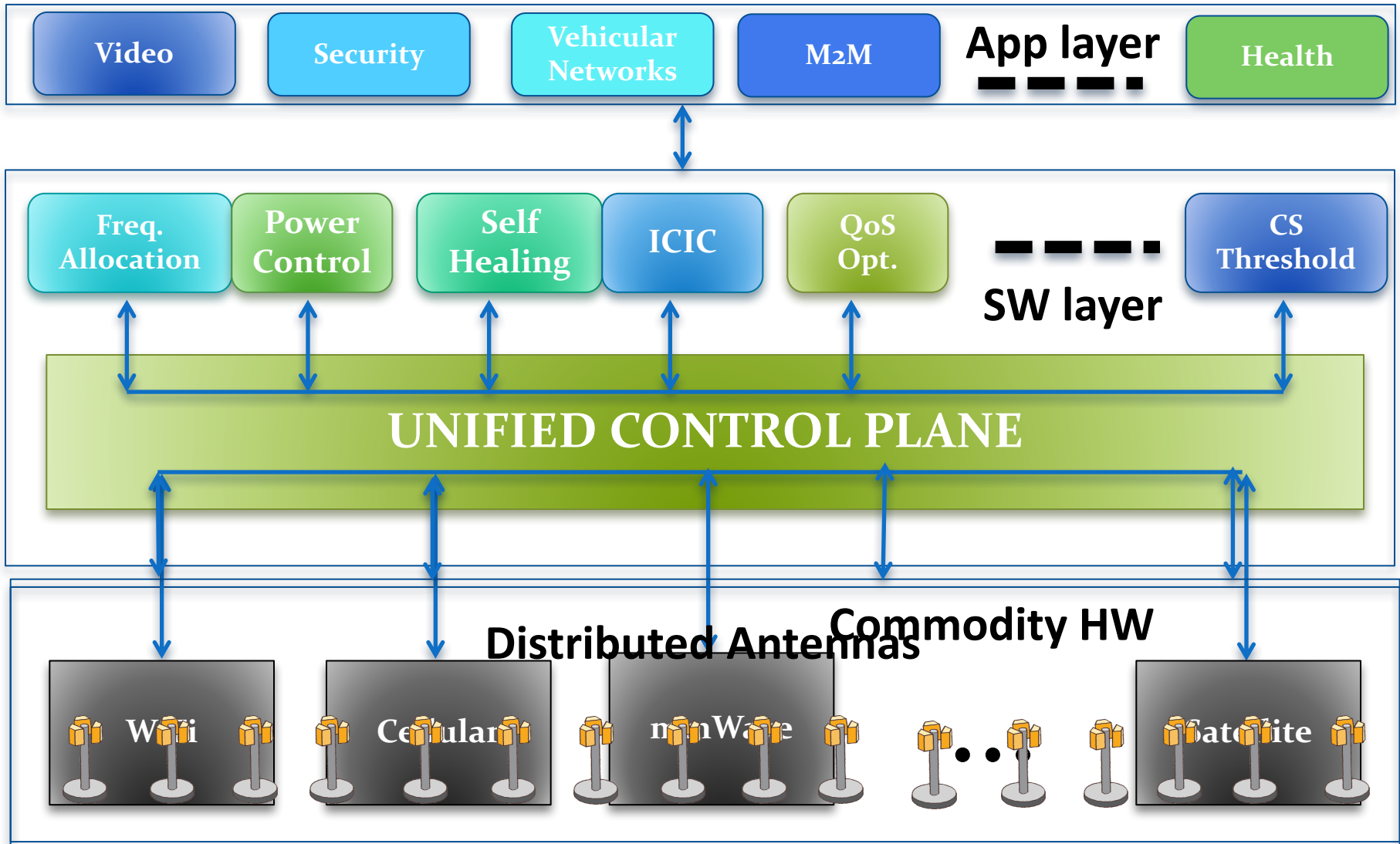


- Future cellular networks will be hierarchical
- Large cells for coverage
- Small cells for capacity and power efficiency
- Small cells require self-optimization in the 

# Why not use SoN for all wireless networks

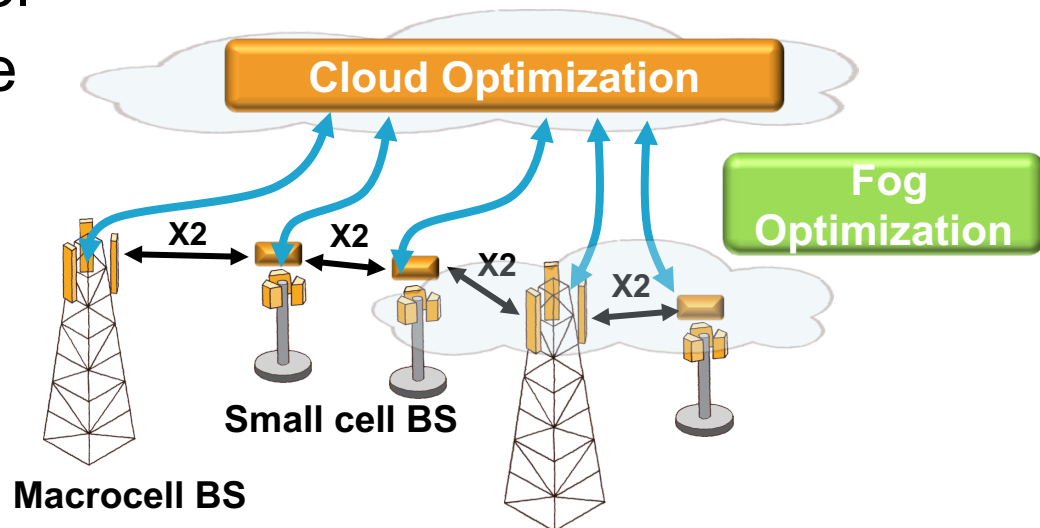


# Software-Defined Network Architecture

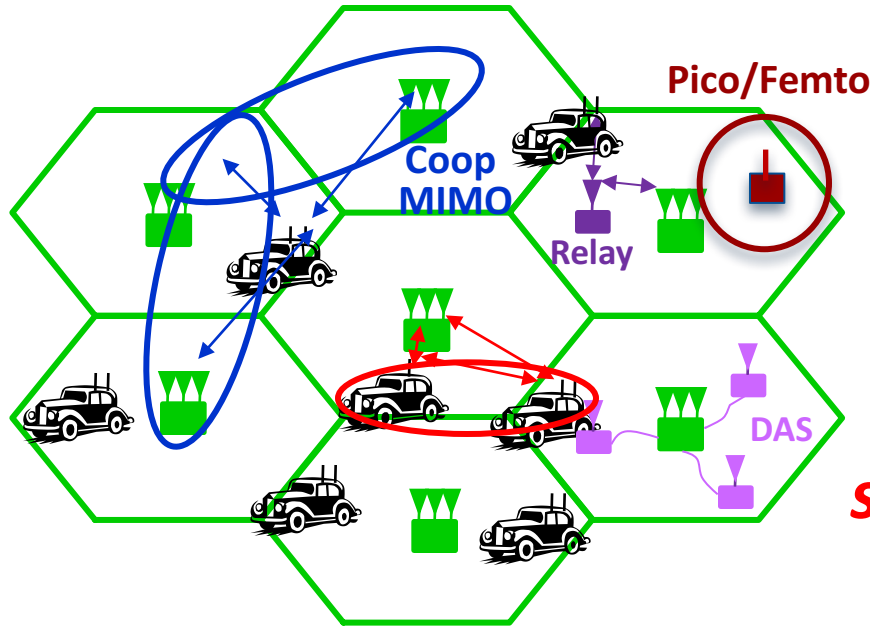


# SDWN Challenges

- Algorithmic complexity
  - Frequency allocation alone is NP hard
  - Also have MIMO, power control, CST, hierarchical networks: *NP-really-hard*
  - Advanced optimization tools needed, including a **combination** of centralized (cloud) distributed, and locally centralized (fog) control
  - **ML** can also play a role
- Hardware Interfaces
- Seamless handoff
- Resource pooling



# “Green” Cellular Networks for the IoT



*How should cellular systems be redesigned for minimum energy?*

*Research indicates that significant savings is possible*

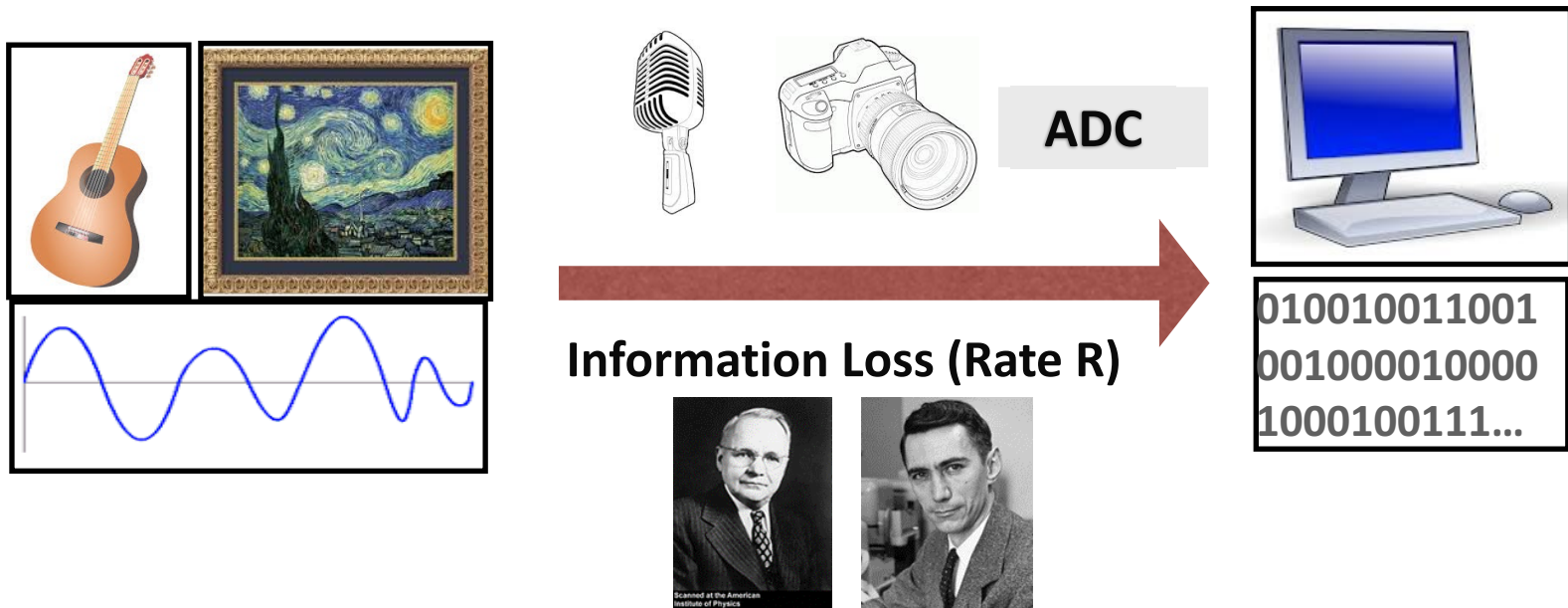
- Drastic energy reduction needed for IoT devices
  - New Infrastructures: cell size, BS placement, DAS, Picos, relays
  - New Protocols: Cell Zooming, Coop MIMO, RRM, Scheduling, Sleeping, Relaying
  - Low-Power (Green) Radios: Radio Architectures, Modulation, coding, MIMO



# Energy-Constrained Radios

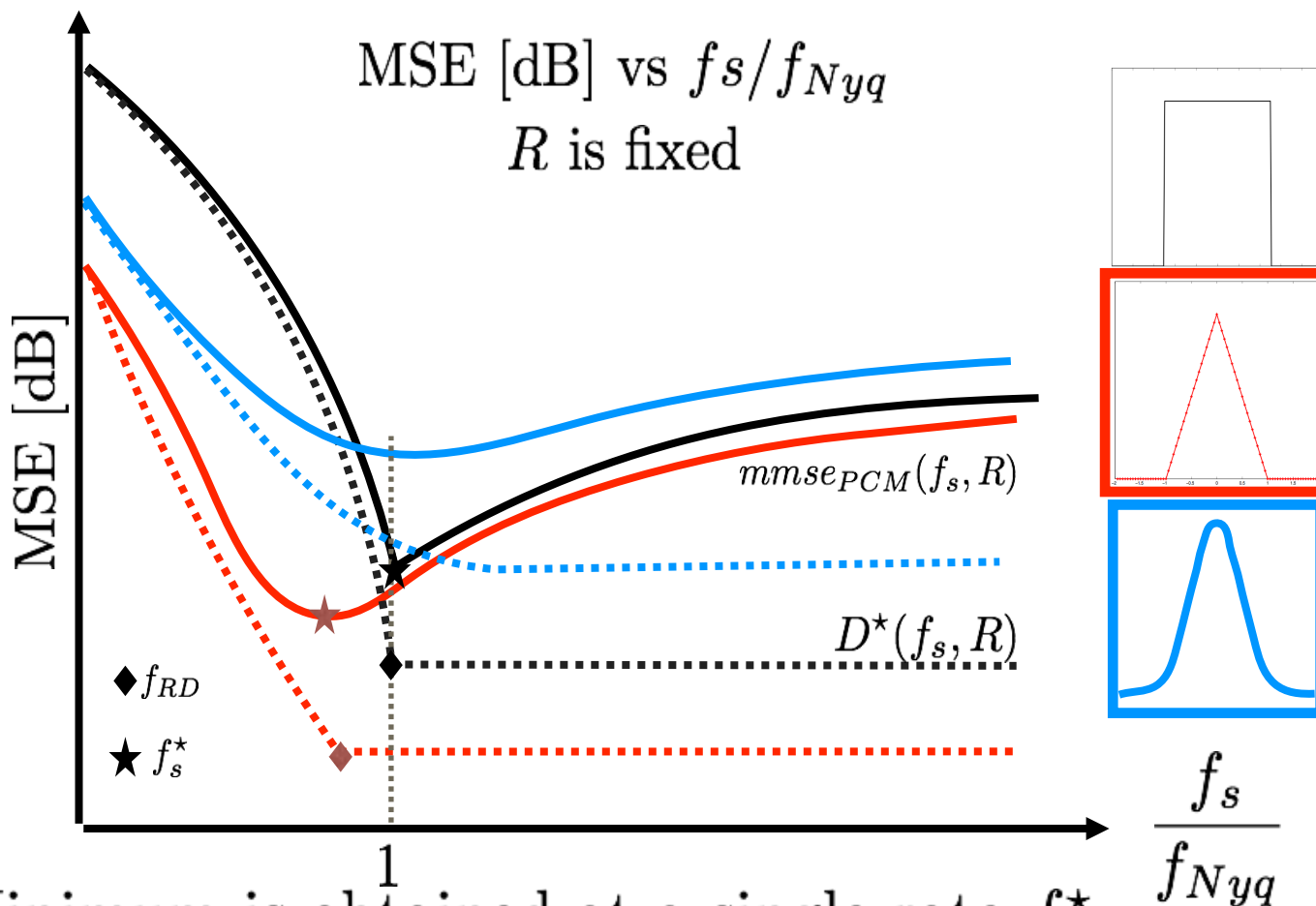
- Transmit energy minimized by sending bits very slowly
  - Leads to increased circuit energy consumption
- Short-range networks must consider both transmit and processing/circuit energy.
  - Sophisticated encoding/decoding not always energy-efficient.
  - MIMO techniques not necessarily energy-efficient
  - Long transmission times not necessarily optimal
  - Multihop routing not necessarily optimal
- Recent work to minimize energy consumption in radios
  - Sub-Nyquist sampling
  - Codes to minimize total energy consumption

# Rate-Distortion Limits of Analog-to-Digital-Compression



**We investigate distortion due to sampling and converting those samples to bits under a bit rate constraint**

# MSE Depends on Input Signal



- ◆ Minimum is obtained at a single rate  $f_s^*$
- ◆  $f_s^* \leq f_{Nyq}$  depending on  $S_X(f)$

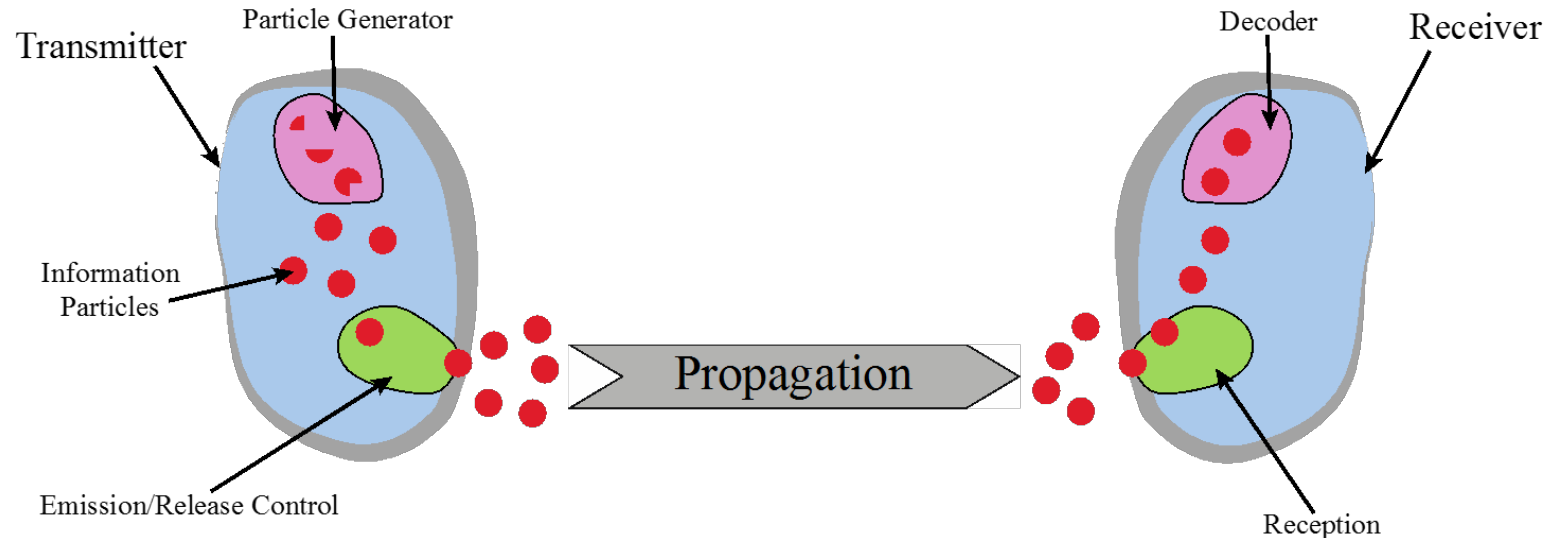
Joint with A. Kipnis  
 and Y. Eldar

# Where should energy come from?



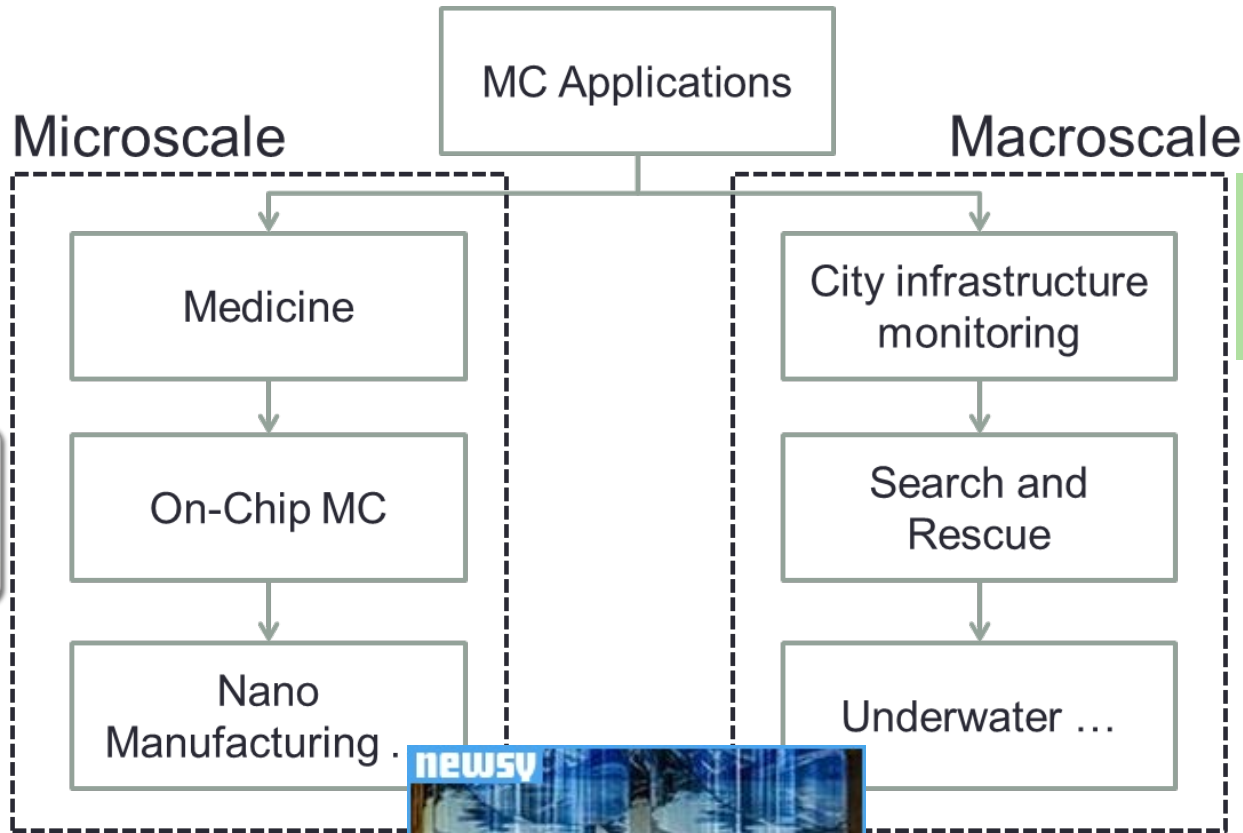
- Batteries and traditional charging mechanisms
  - Well-understood devices and systems
- Wireless-power transfer
  - Poorly understood, especially at large distances and with high efficiency
- Communication with Energy Harvesting Devices
  - Intermittent and random energy arrivals
  - Communication becomes energy-dependent
  - Can combine information and energy transmission
  - New principles for communication system design needed.

# Chemical Communications



- Can be developed for both macro ( $>\text{cm}$ ) and micro ( $<\text{mm}$ ) scale communications
- Greenfield area of research:
  - Need new channel models, modulation schemes, channel impairment mitigation, multiple access, etc.
  - Fundamental capacity limits also unknown

# Applications

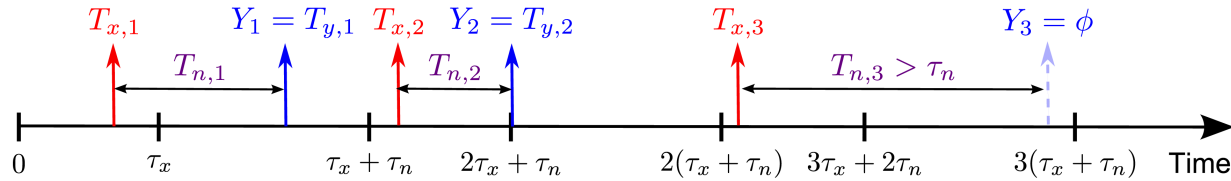
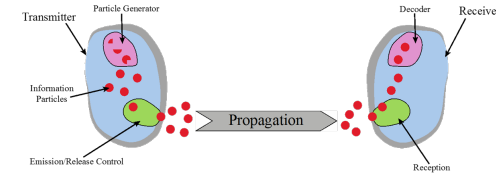


**Data rate: .5 bps**

**“fan-enhanced” channel**



# Chemical Channel Capacity



## • Diffusion-Based Propagation

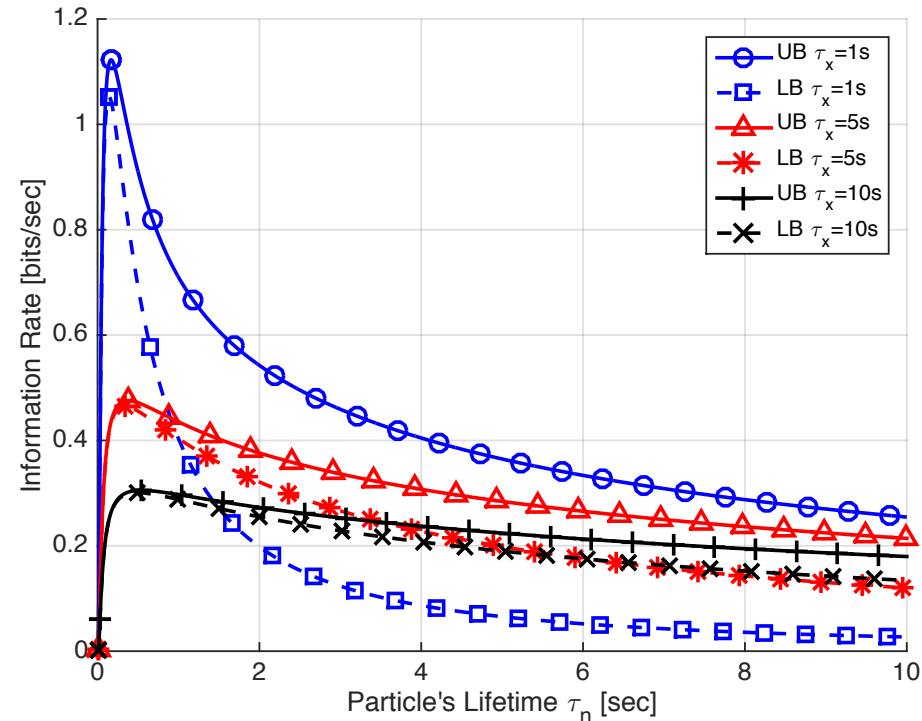
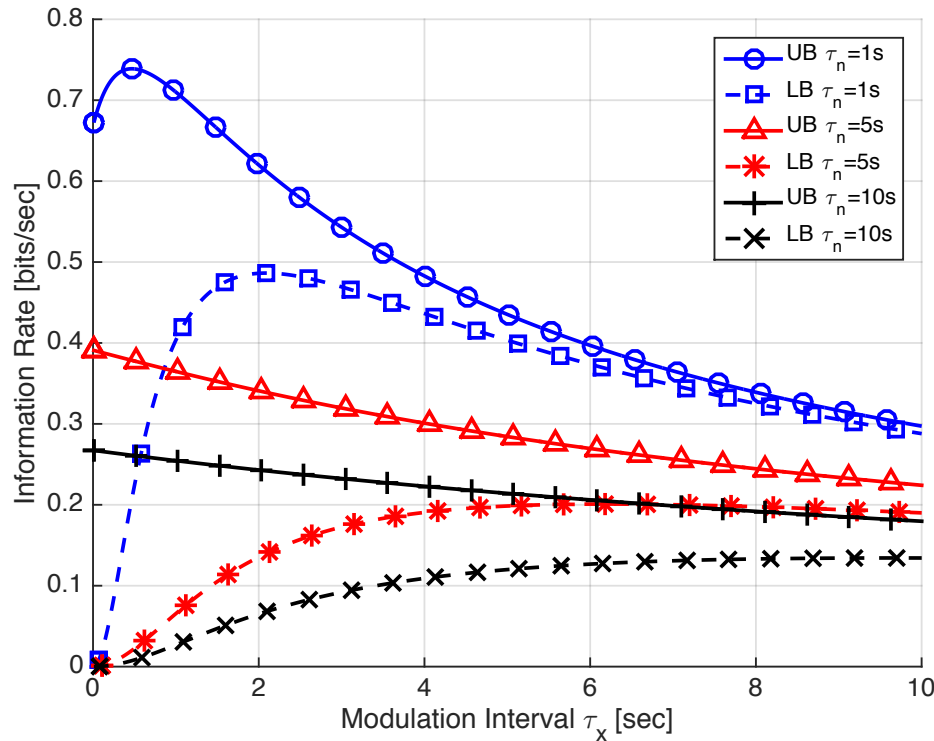
- Information encoded in TX release time of a molecule over symbol interval  $\tau_x$
- Particle dissipates after duration  $\tau_n$  (channel dependent)
- Diffusion propagation introduces a random time-of-arrival “noise”  $T_n$
- Distribution of  $T_n$  modeled as additive Levy noise

## • Capacity obtained by optimizing symbol interval

$$C(\tau_n) = \max_{\tau_x, \mathcal{F}(\tau_x)} \frac{I(T_x; T_y | T_n < \tau_n) F_{T_n}(\tau_n)}{\tau_x + \tau_n} = \max_{\tau_x, \mathcal{F}(\tau_x)} \frac{I(T_x; Y)}{\tau_x + \tau_n}$$

- Y has no closed form pdf
- Can obtain upper and lower capacity bounds

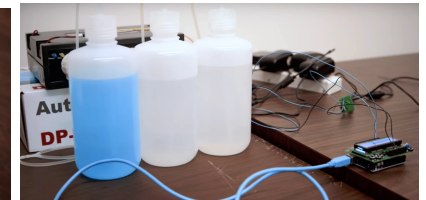
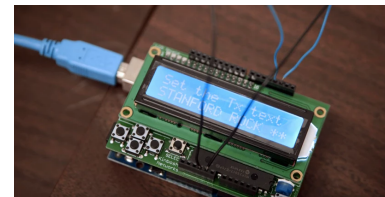
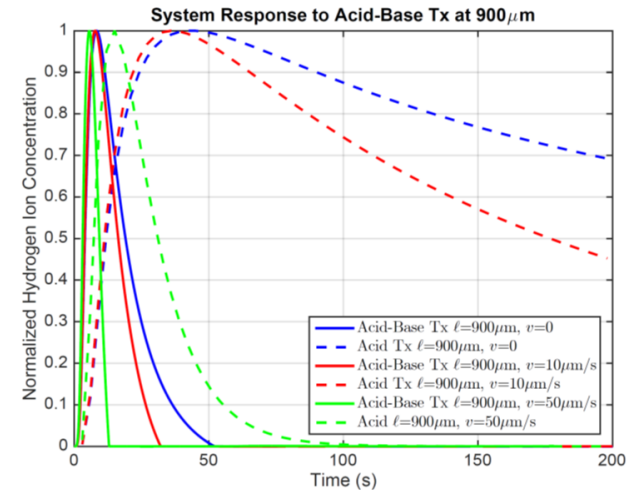
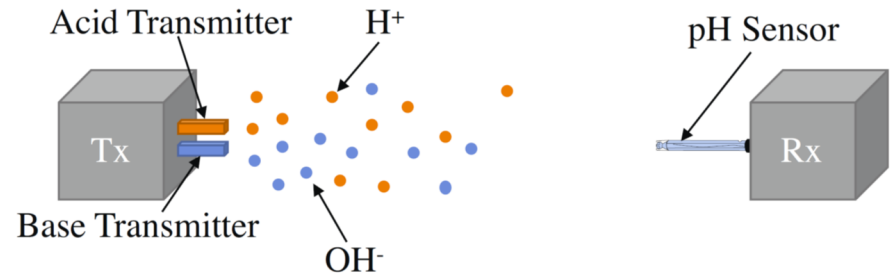
# Capacity Bounds



Multiple particle release (diversity) leads  
to a log linear increase in capacity

# Current Work

- Slow dissipation of chemicals leads to ISI
- Can use acid/base transmission to decrease ISI
- Similar ideas can be applied for multilevel modulation and multiuser
- Equalization requires machine learning
  - Applied to both SISO and MIMO
  - Leads to a 10x data rate increase
- Currently reducing to nanoscale



*Sending text messages with windex and vinegar*

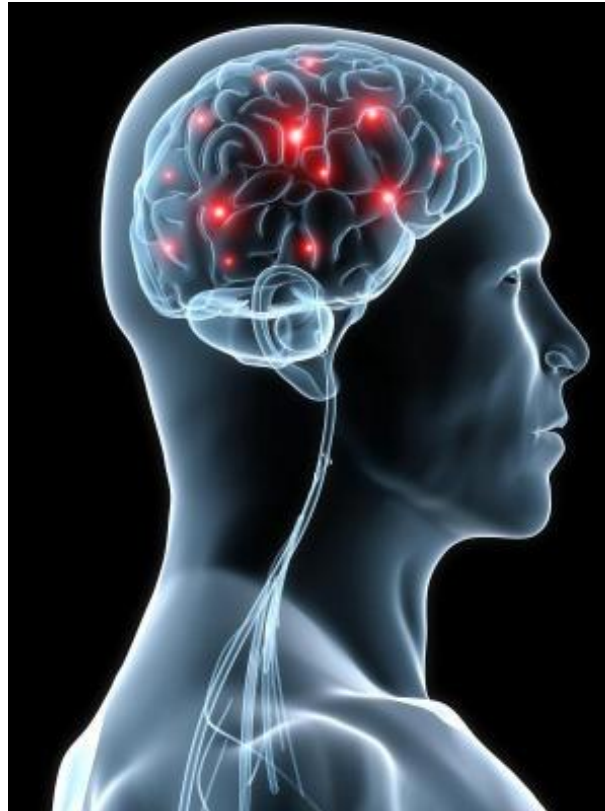


**Stanford Report:  
November 15, 2016**

# Machine Learning in Communications

- ML has excellent performance in equalization for molecular communications
- Application of ML to communication systems with unknown channel model/parameters
  - Channels include molecular, mmWave, THz, ...
  - Modulation and detection
  - Encoding and decoding
  - Joint source and channel decoding
  - ML algorithm and training optimization needed
    - That is where Communication Theory comes in

# The brain as a communications network

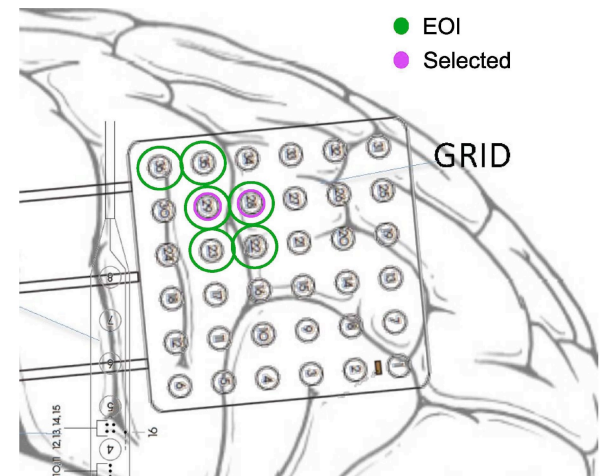
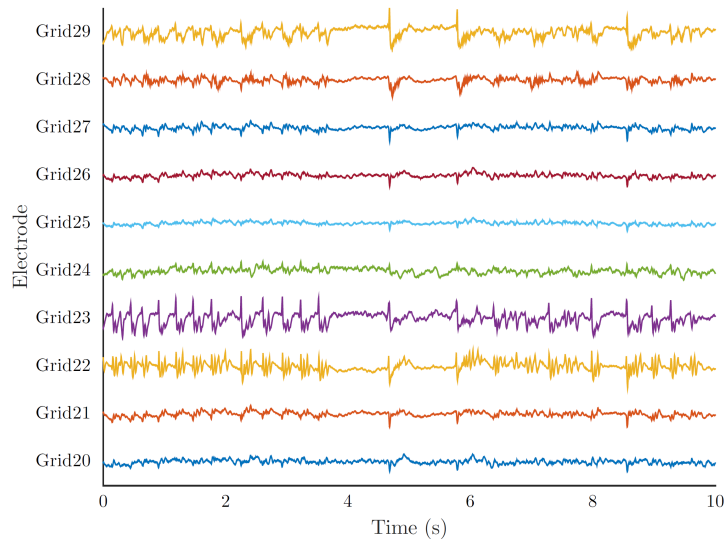
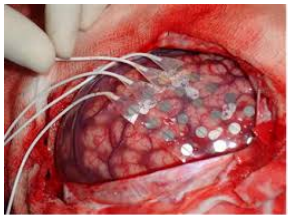


**Joint with N. Soltani, T. Coleman, R. Ma, J. Kim, Y. Morin and J. Parvizi**

# Epileptic Seizure Focal Points

- Seizure caused by an oscillating signal moving across neurons
  - When enough neurons oscillate, a seizure occurs
  - Treatment “cuts out” signal origin: errors have serious implications
- Directed mutual information spanning tree algorithm applied to ECoG measurements estimates the focal point of the seizure
- Application of our algorithm to existing data sets on 3 patients matched well with their medical records

## ECoG Data





# Summary

- The next wave in wireless technology is upon us
  - This technology will enable new applications that will change people's lives worldwide
- Future wireless networks must support high rates for some users and extreme energy efficiency for others
  - Small cells, mmWave massive MIMO, Software-Defined Wireless Networks, and energy-efficient design key enablers.
  - Machine learning is a promising new tool to use in receiver design, multiple access, and resource optimization
- Communication tools and modeling techniques may provide breakthroughs in other areas of science