



# **Lincoln Laboratory Ad-hoc MIMO Adaptive Communication Simulation Tool**

**Adam Margetts, Derek Young,  
Bruce McGuffin, Dan Bliss, Glenn  
Fawcett, and Lloyd the Llama**

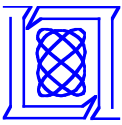


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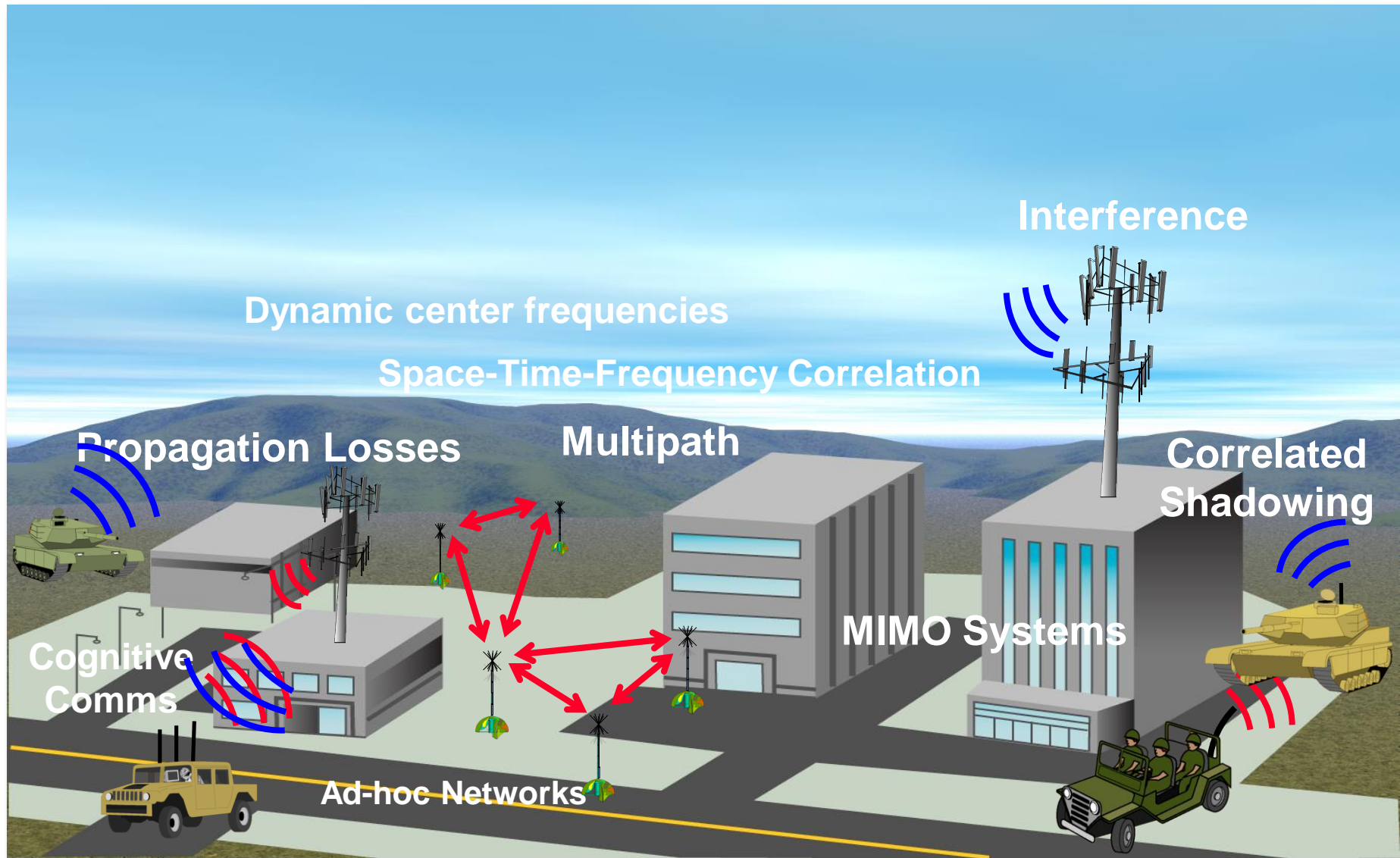
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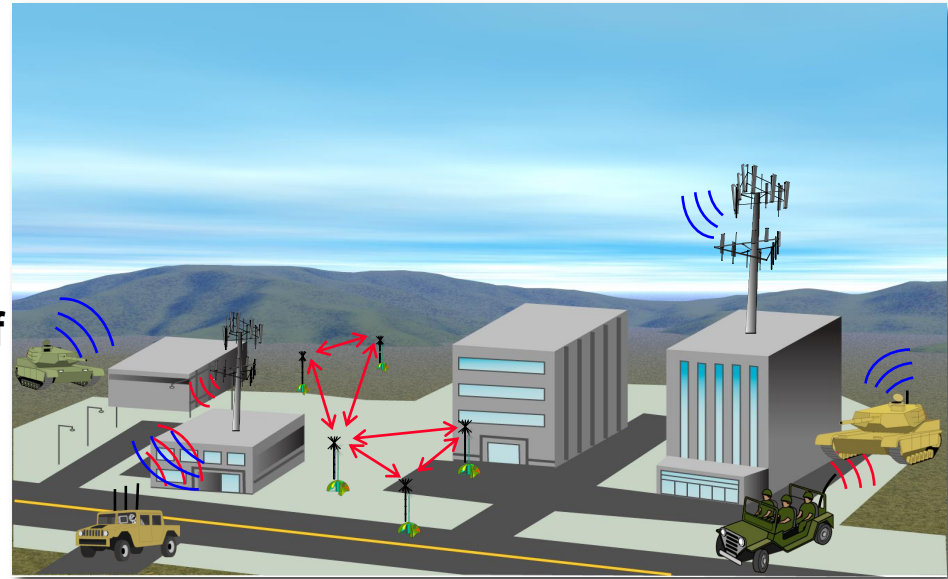
# Simulation Environment Overview





# Simulation Capabilities

- Operate multiple radio nodes simultaneously and asynchronously
- Generate realistic space-time-frequency MIMO fading channels
- Model propagation over a variety of environments:
  - Urban, suburban, rural
  - Indoors, outdoors, fixed, mobile, or airborne
  - Line-of-sight or non-line-of-sight
  - Link lengths meters to tens of kilometers
  - Frequencies: 10 MHz to 6 GHz

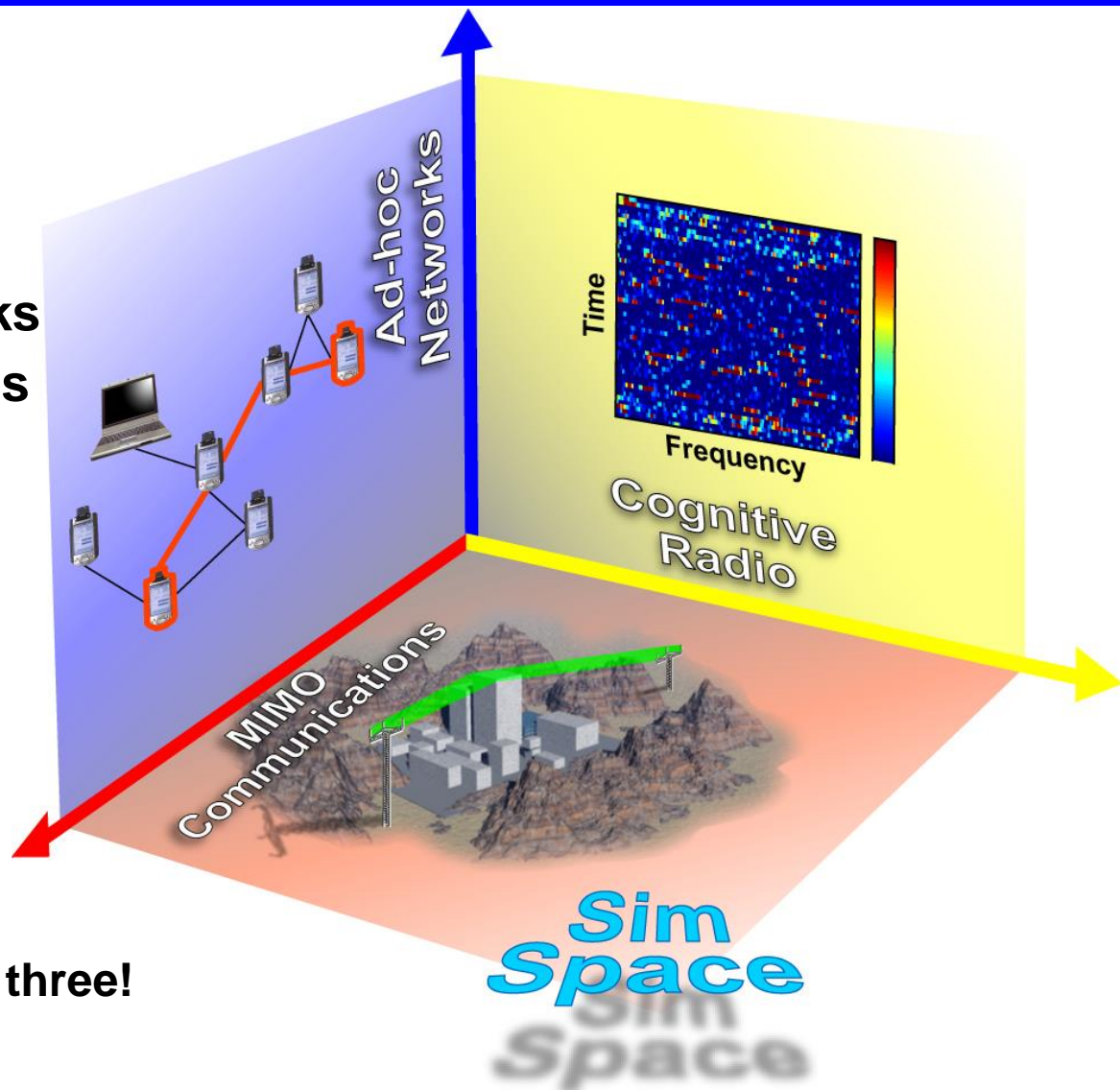




# Problem Set

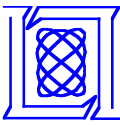
## Motivating Scenarios:

1. Cognitive Radios
2. Ad-hoc Radio Networks
3. MIMO Communications



LLAMAComm combines all three!

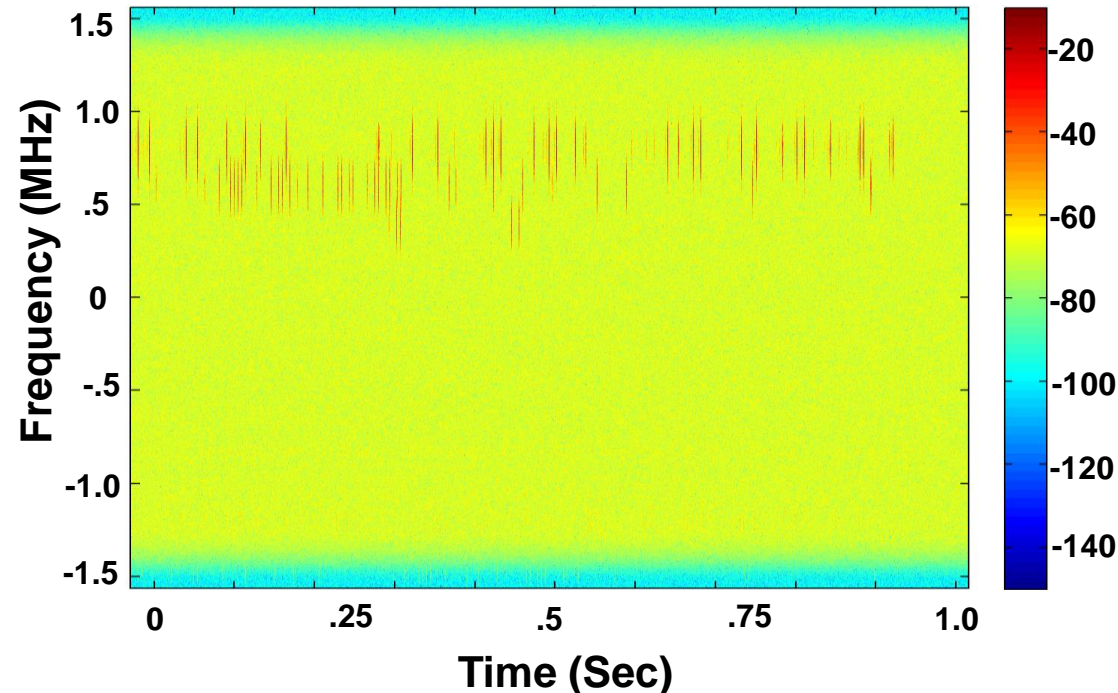




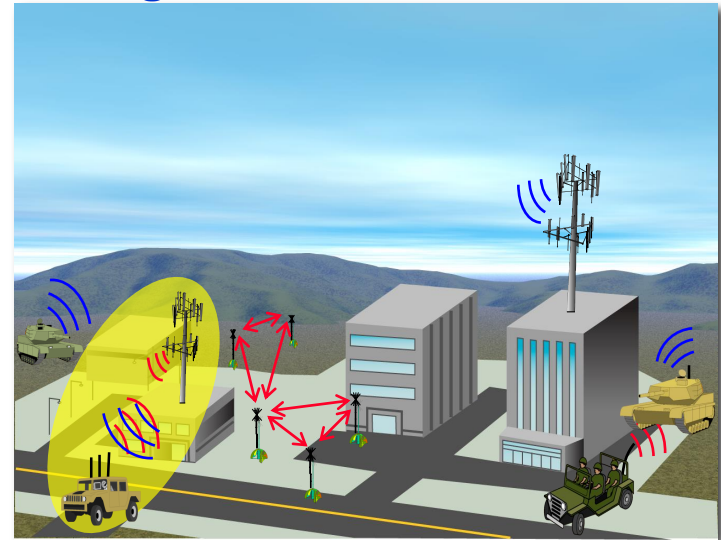
# Adaptive Cognitive Radio

- Radio spectrum is underutilized
- Cognitive radios identify and occupy time-frequency gaps
- Requires simulating a wide range of center frequencies

Spectrum Occupancy



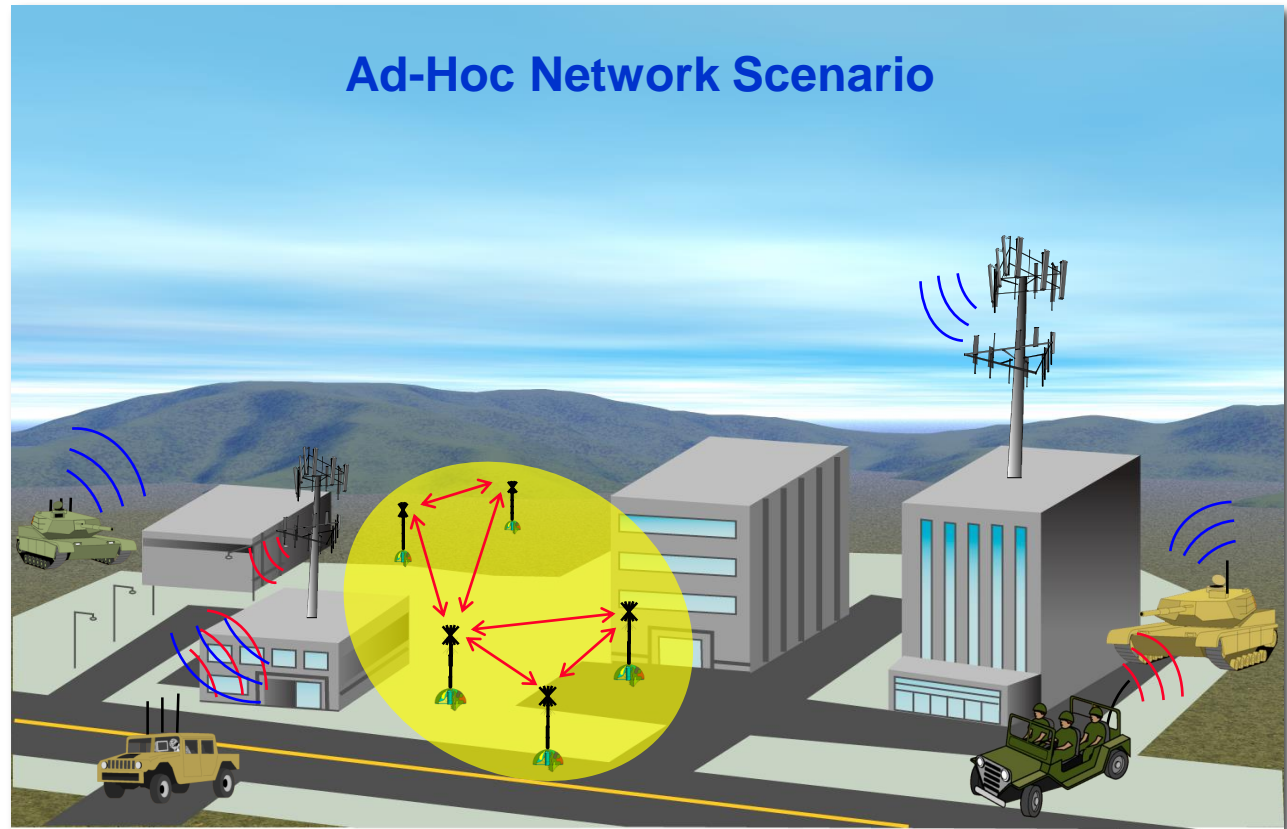
Cognitive Radio Scenario





# Wireless Ad-hoc Networks

- Formed dynamically
- Multi-hop communications
- Nodes interact asynchronously
- Simulation provides datalink layer control

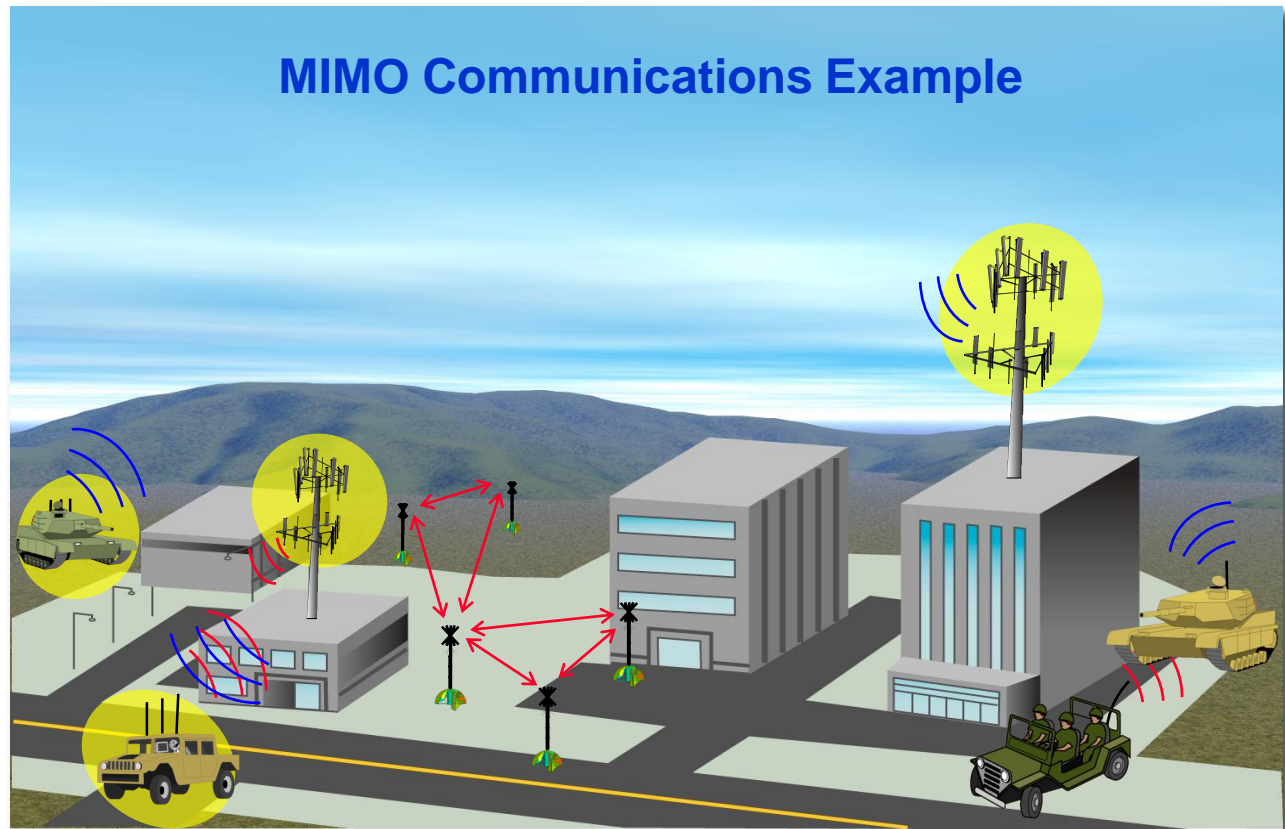




# MIMO Communication

## Multiple-Input Multiple-Output

- Arrays of antennas at transmitter and receiver
- Increases reliability and throughput
- Adaptively nulls interference sources
- Simulate space-time-frequency correlations







# Available Wireless Network Simulators

- **Opnet**
  - Commercial
  - Probabilistic physical layer
- **Ns2**
  - Open source (large research user base)
  - Probabilistic physical layer
- **QualNet**
  - Commercial
  - Probabilistic physical layer
- **ISIS Prowler (Probabilistic Wireless Network Simulator)**
  - Gyula Simon (Vanderbilt University)
  - Written in Matlab
  - Probabilistic physical layer
- **SWANS (Scalable Wireless Network Simulator) (built on JiST)**
  - Claimed 1,000,000 nodes simulated on a PC
  - Probabilistic Physical Layer

**Physical Layer  
Too Simple**

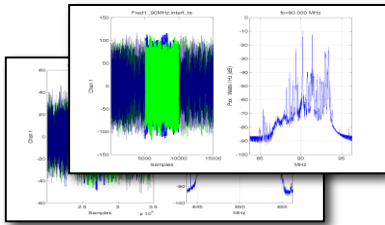
- Numerous cell-site planning tools
- Wireless Insight (cousin to XFDTD)
  - Solves Maxwell Equations

**Too Complex**

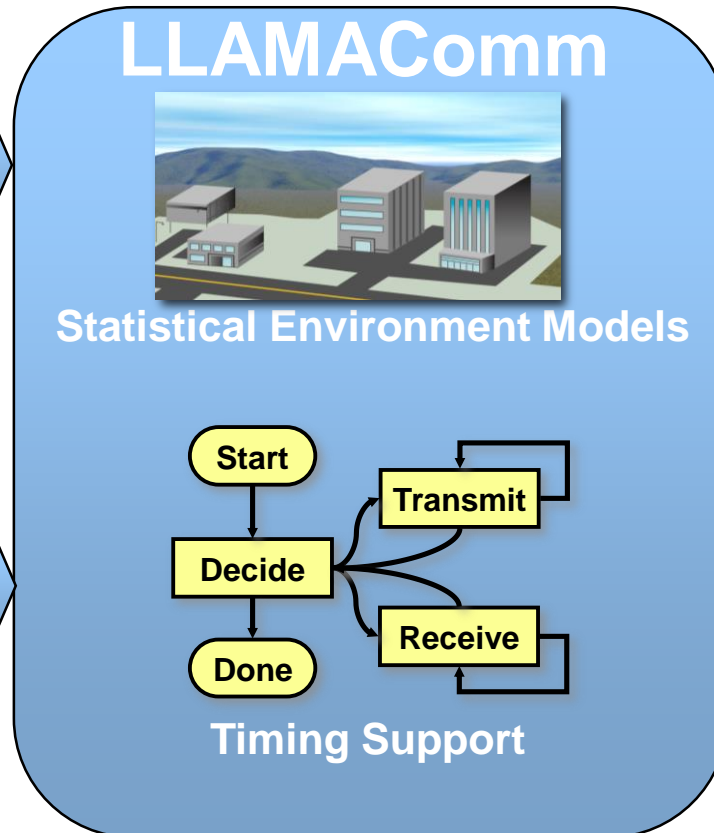
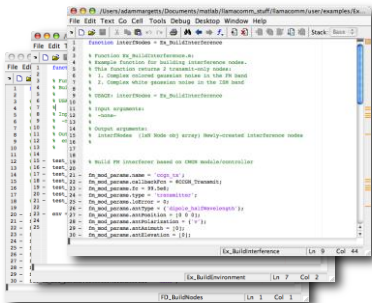
- *Simulation should be as simple as possible, but no simpler*



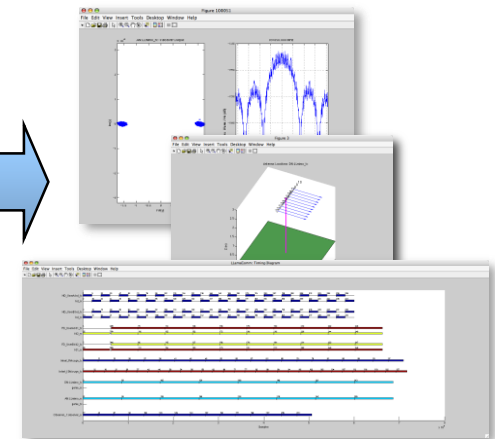
- ## Recorded Interference

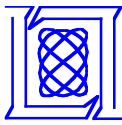


## User-Defined Functions and Parameters



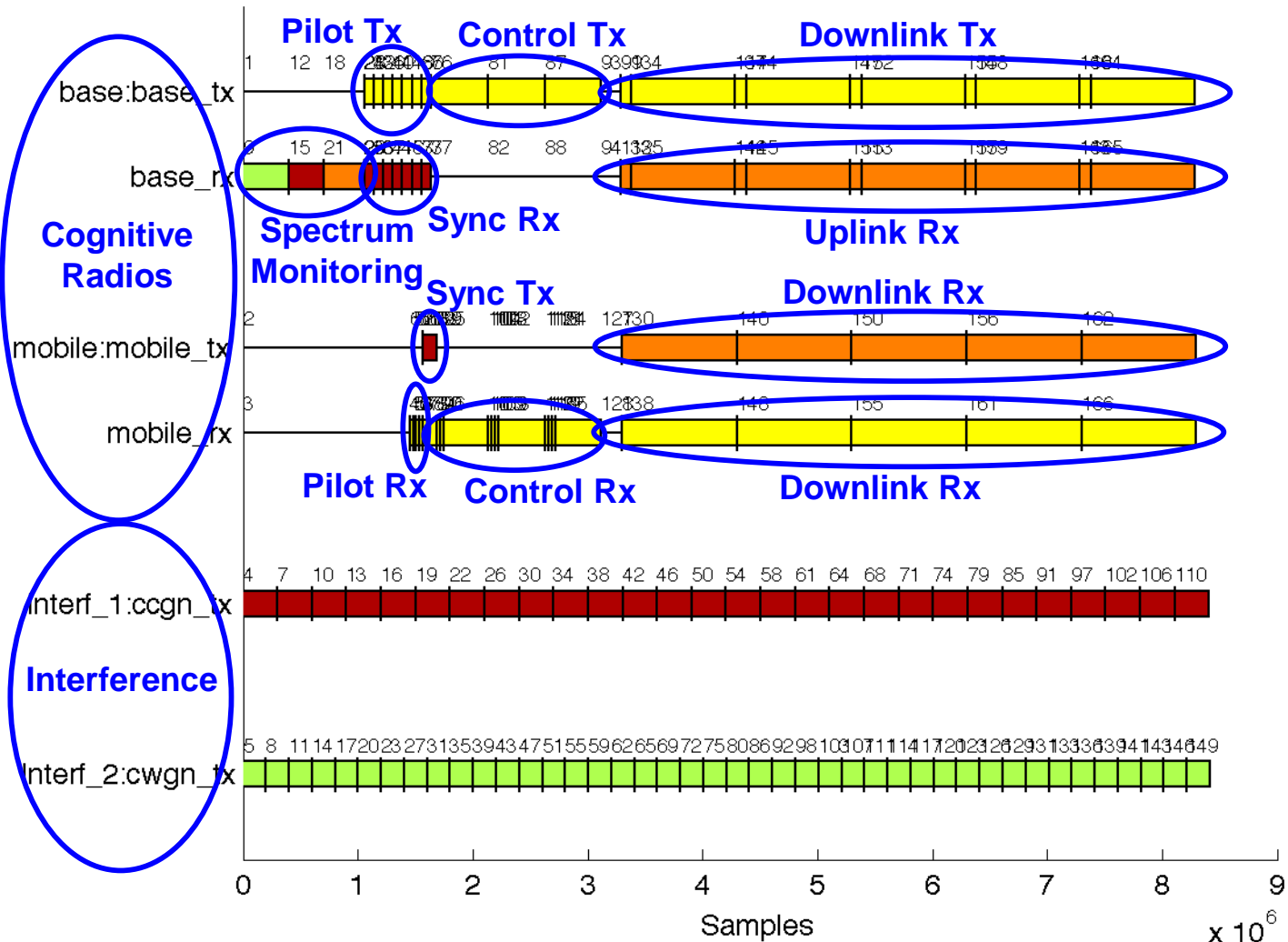
## Results





# LLAMAComm Timing Diagram Example

- Complex datalink simulations are possible
  - Colors indicate center frequency





- **MATLAB R2009b or later**
  - **Signal processing toolbox**
- **Familiarity with MATLAB programming**
- **Fast processor**

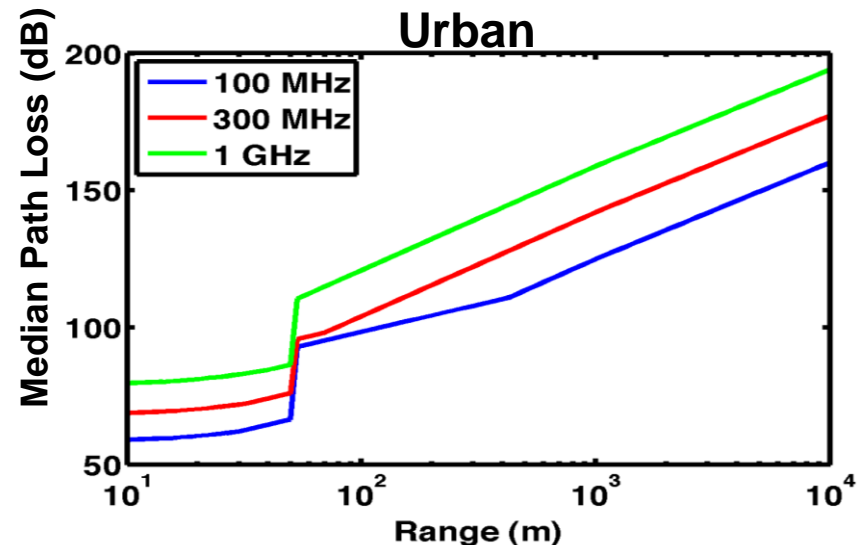
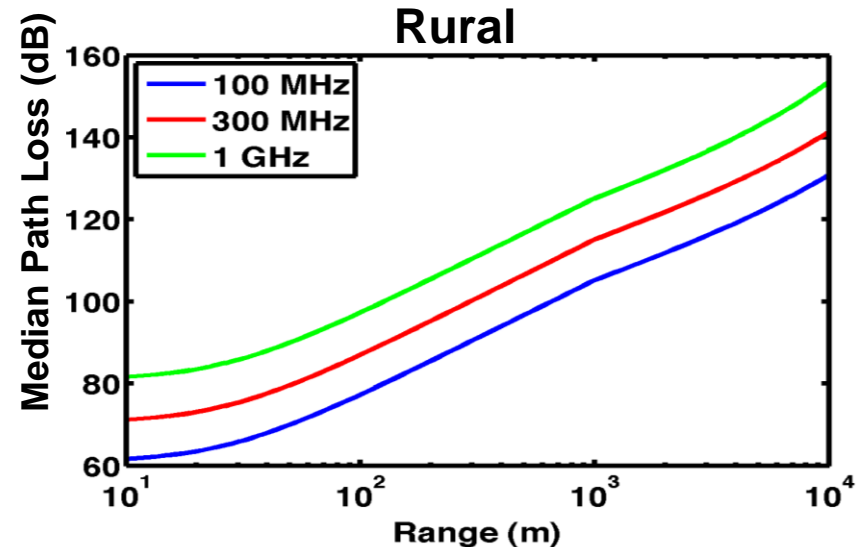


# Scope of LLAMAComm Path Loss Models

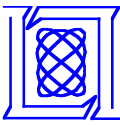
LLAMA Comm

- **Input parameter range**
  - frequency: 10 MHz – 6 GHz
  - range: 1 m – 300 km<sup>(1)</sup>
  - antenna height: 1 m – 10 km
- **Supported environments**
  - urban/suburban/rural
  - in-building/building penetration/outdoors
- **Model Outputs**
  - log-normal shadowing loss
    - median power loss
    - standard deviation
    - shadowing correlation with angle
  - multipath fading
    - Rice k-factor
    - delay spread

(1) Longer ranges only required for very high receivers

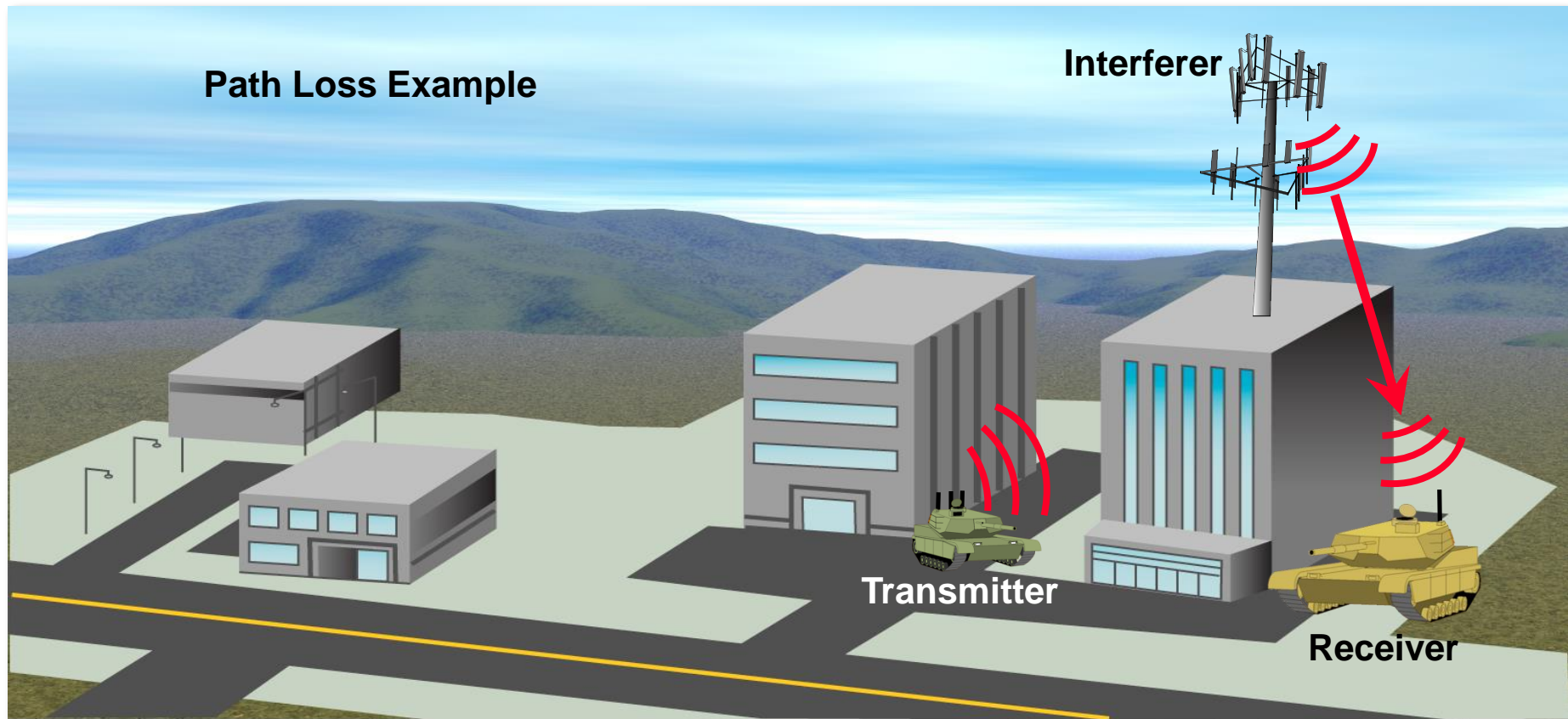






# Path Loss Example

- Examine path loss from Interferer to Receiver
  - Urban environment
  - Outdoors
  - Receiver below roof height
  - Range > 1 km





# Path Loss Model

LLAMA Comm

10 MHz-6 GHz, 10 m–20 km, Multiple Environments & Sites

## Setting and Terminal Data:

Environment?  
Indoors/Outdoors?  
Indoor Range  
External Wall Type (concrete)  
# Internal Walls  
External Wall Angle  
Terminal Heights?  
Avg. Building Height  
Range?  
Center Frequency?

## Environment:

Suburban...

Urban

Rural...

## Terminal Sites:

One indoors...

Both outdoors

Both indoors...

## Terminal Heights:

(Lower/Higher)

Below roof height,  
Below roof height...

Below roof height,  
Near roof height...

Below roof height,  
Above roof height and below 200 m

Below roof height,  
Above 200 m...

Above roof height,  
Below 1000 m...

Above roof height,  
Above 1000 m...

## Range:

Range < 50 m...

Range < 1 km...

Range > 1 km  
(max depends on freq)

## Frequency:

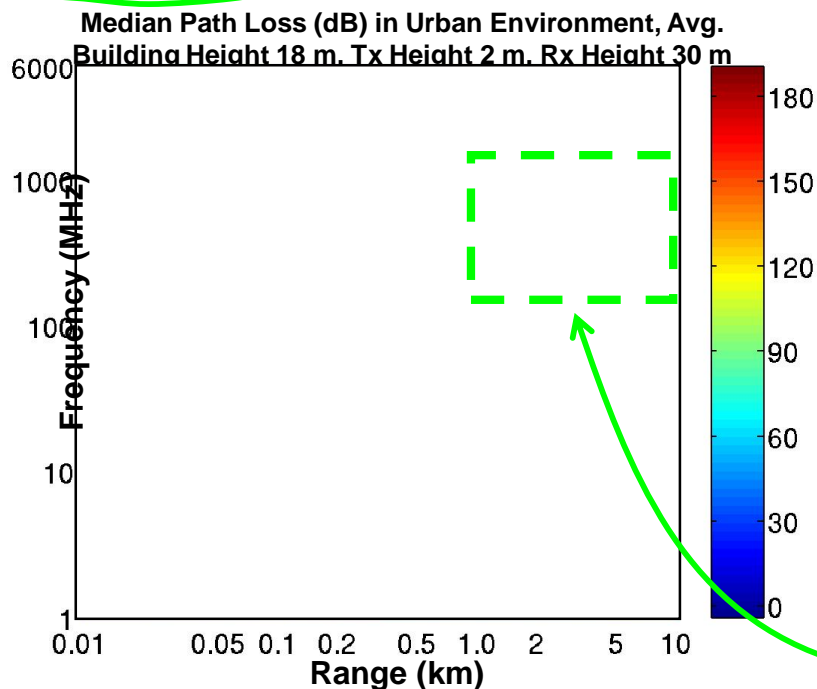
Path Loss Median/  
Standard deviation,  
(Model Also Provides  
Rice K-Factor,  
Shadow-Loss Correlation  
Between Links)

Freq < 150 MHz  
(Longley-Rice  
w/Urban  
Correction/  
Okumura-Sigma)

150 MHz < Freq  
< 1500 MHz  
(Hata/Okumura  
-Sigma)

Freq > 1500 MHz  
(Hata w/ COST  
Freq. Correction,  
Okumura-Sigma)

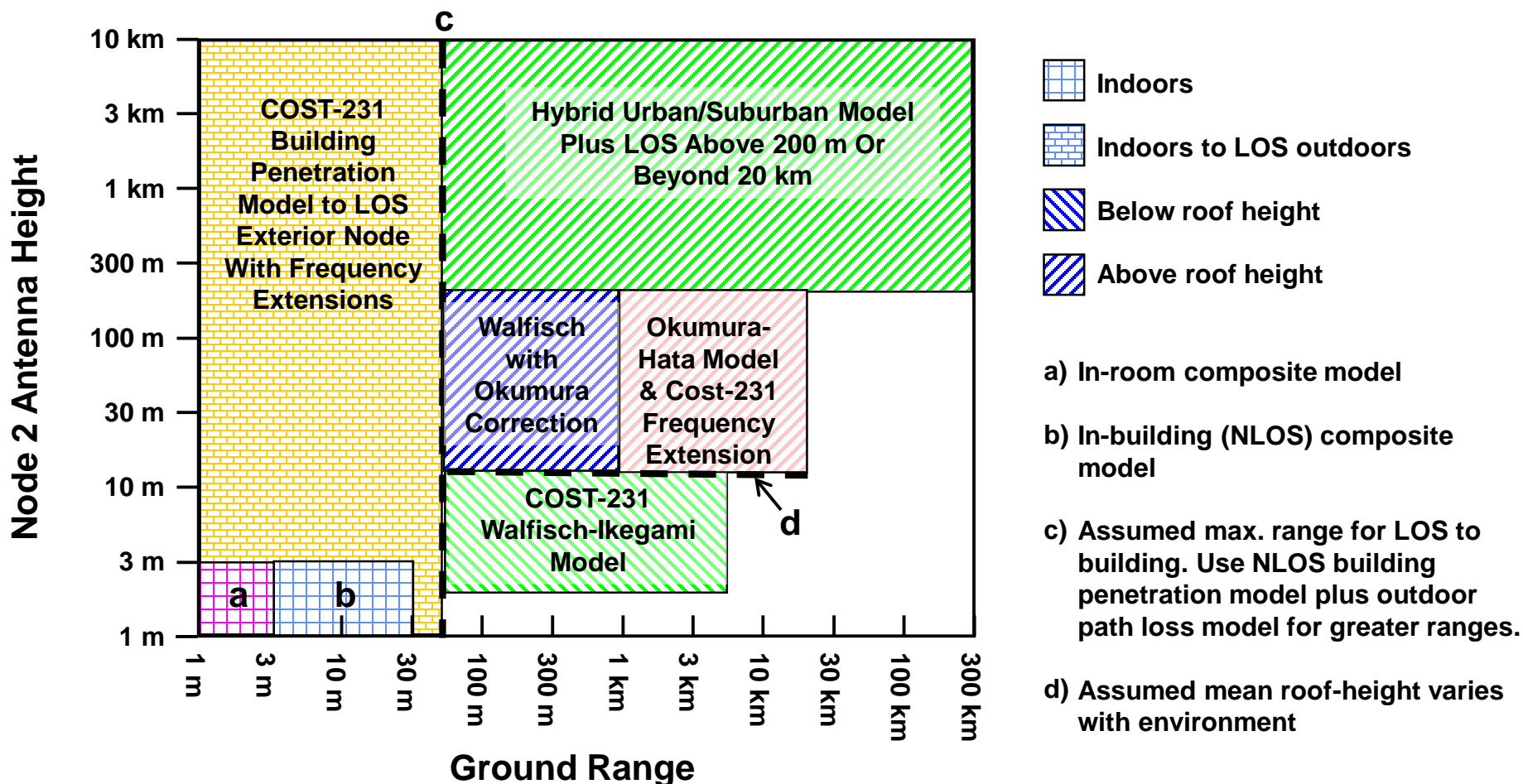
Existing Models,  
Extensions or  
Modifications of Existing  
Models, or New Models  
As Required

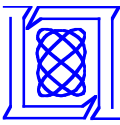




## Node 1 Indoors

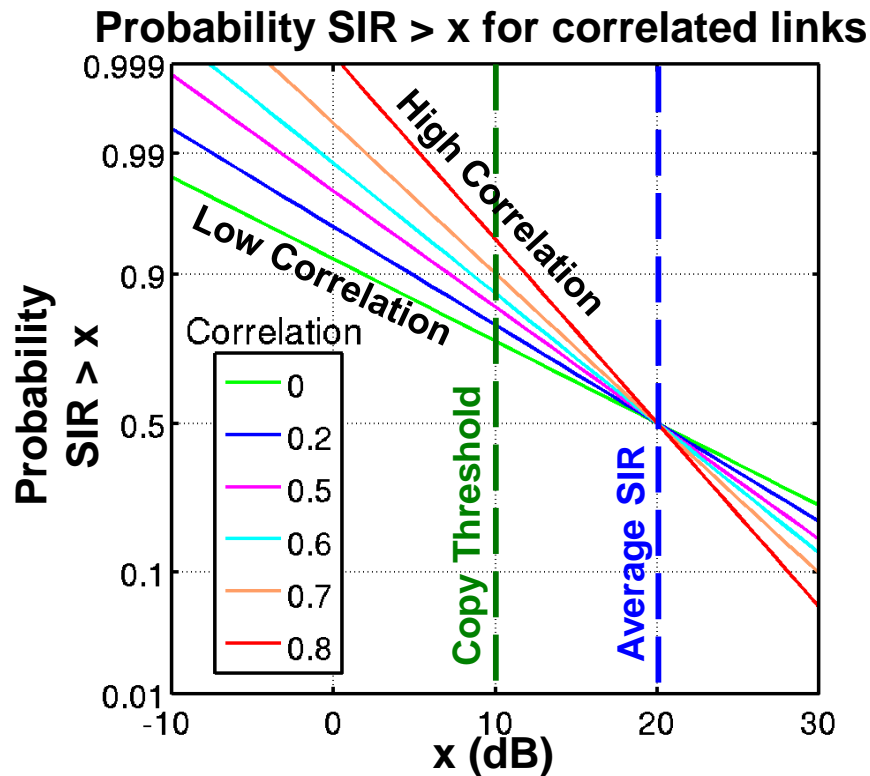
- Path loss model includes indoor-to-outdoor links
  - Loss depends on range, antenna heights, frequency, etc.



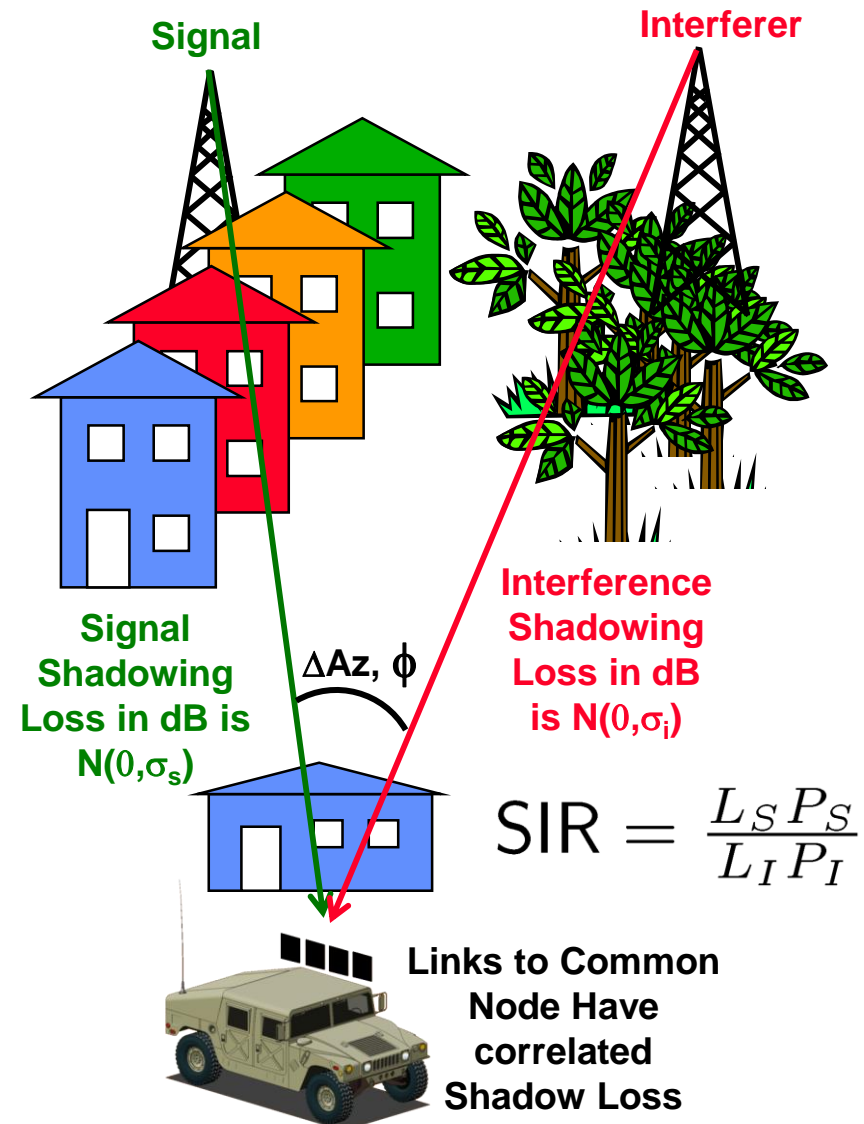


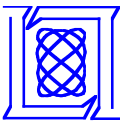
# Correlated Shadowing

Shadow loss correlation reduces signal-to-Interferer power variation



Example: Average SIR = 20 dB  
Shadowing Std. Dev. = 10 dB  
Copy Threshold = 10 dB  
Copy Prob. Varies from 76% to 94%





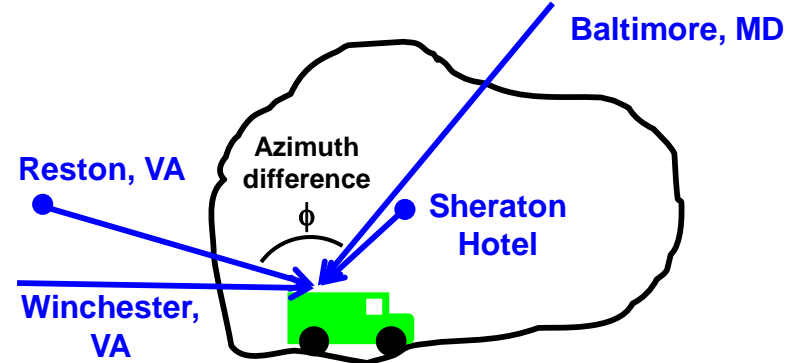
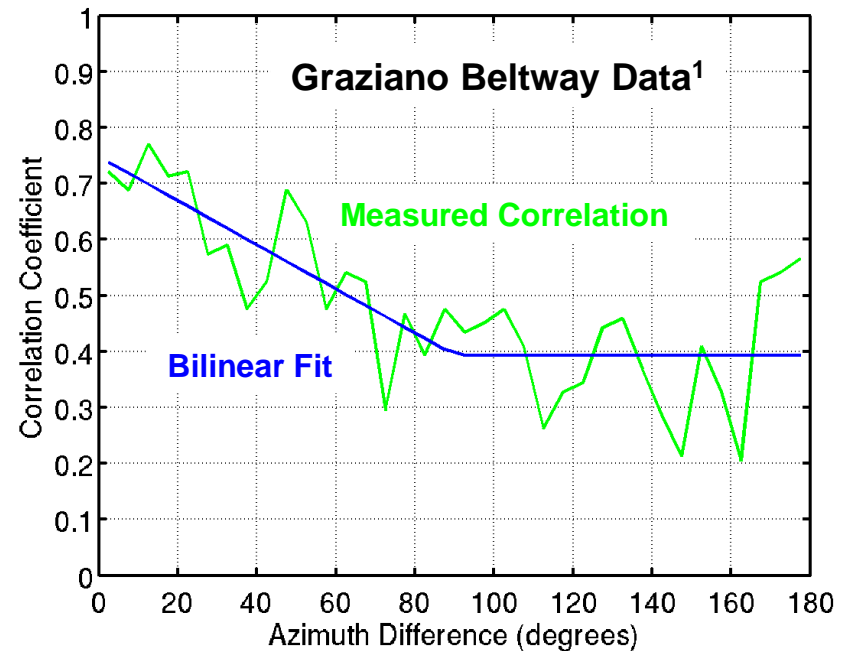
# Shadowing Correlation Coefficient

- Link shadow loss is correlated
  - Depends on angle separation
- Limited data available
  - Graziano measured at 900 MHz around Washington Beltway<sup>1</sup>
  - Similar results by van Rees at 150 MHz, 450 MHz, 900 MHz in The Hague<sup>2</sup>

- Approximate Graziano's measurements with bilinear fit

$$\rho = \begin{cases} 0.75 - 0.004\Delta\phi & |\Delta\phi| \leq 90^\circ \\ 0.004 & 90^\circ < |\Delta\phi| \leq 180^\circ \end{cases}$$

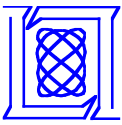
- Lower MSE than proposed functions found in literature
- Min > 0 reflects homogeneous environment in different directions
- Max < 1 reflects uncorrelated shadowing at far end of links



1) Victor Graziano, "Propagation Correlations at 900 MHz", IEEE Trans. Veh. Tech., Nov. 1978

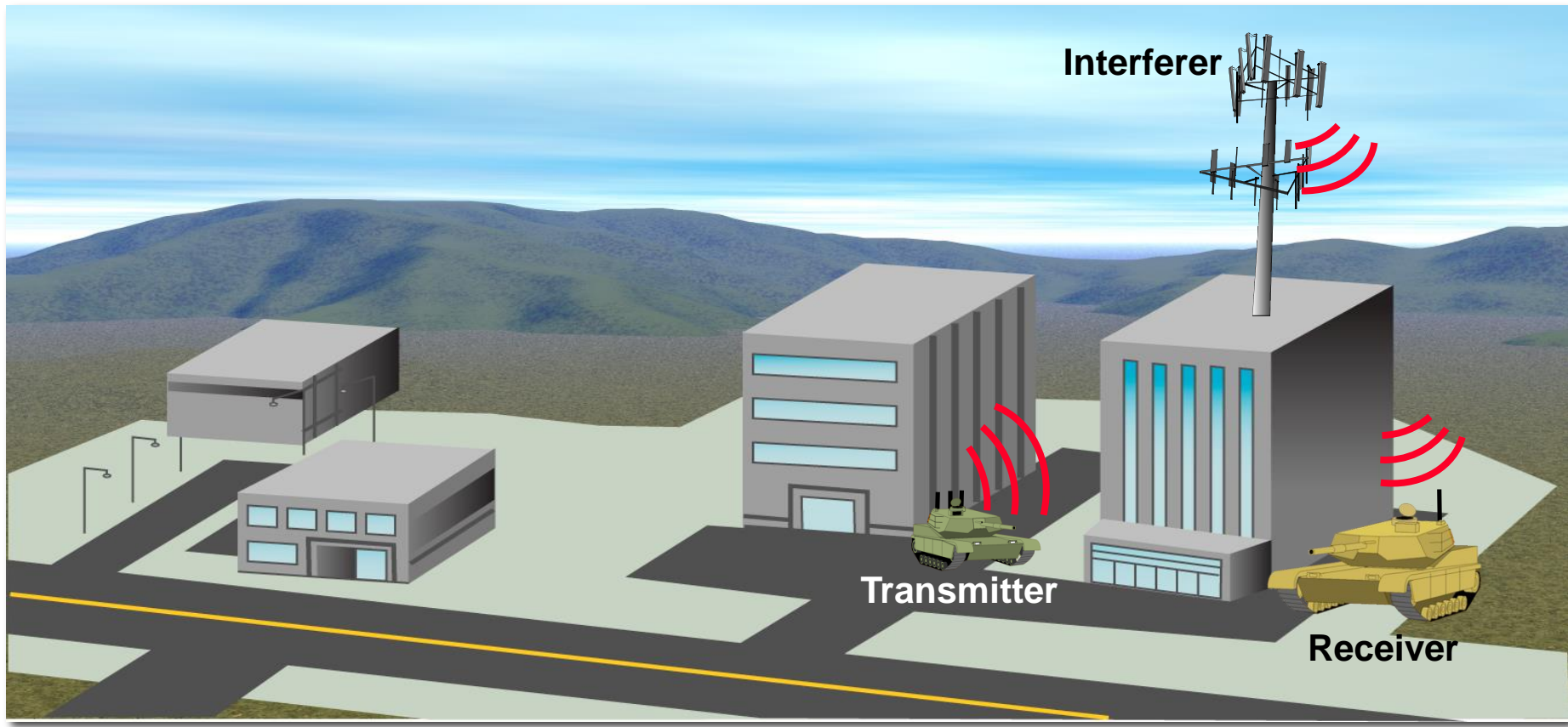
2) Jan van Rees, "Cochannel Measurements for Interference Limited Small-Cell Planning", Archiv Elek. Ubertrag., 1988, pp 318-320

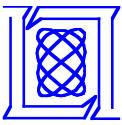




# Channel Processing Example

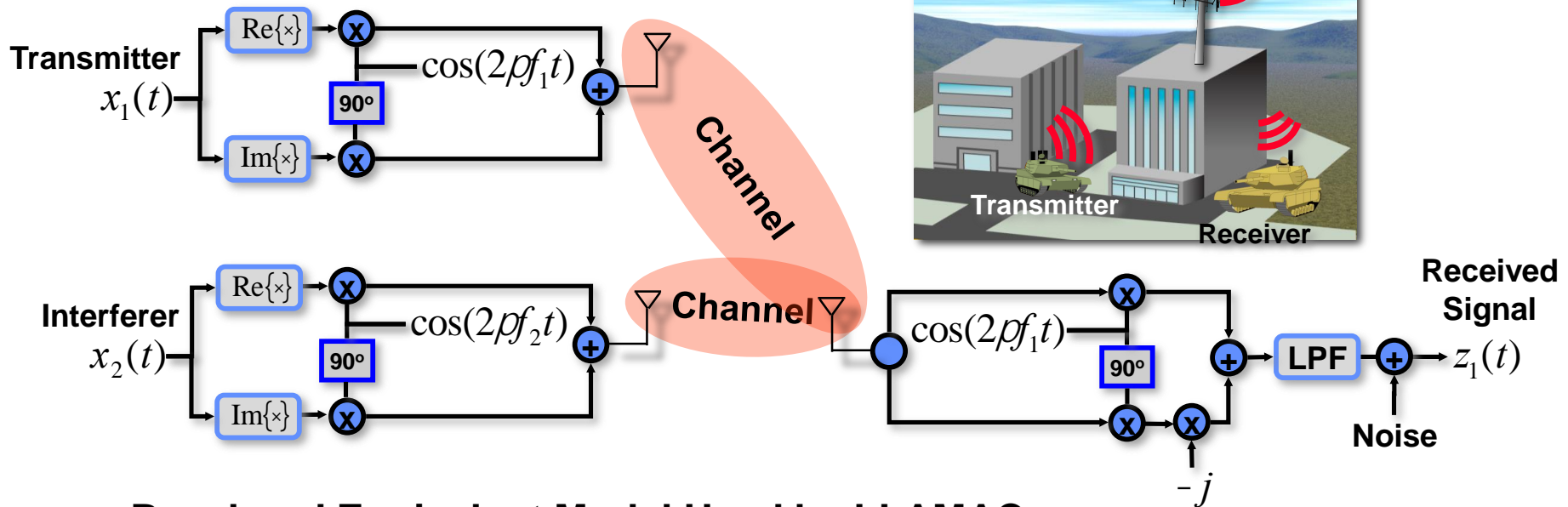
- Interferer operates at nearby center frequency
- Causes interference



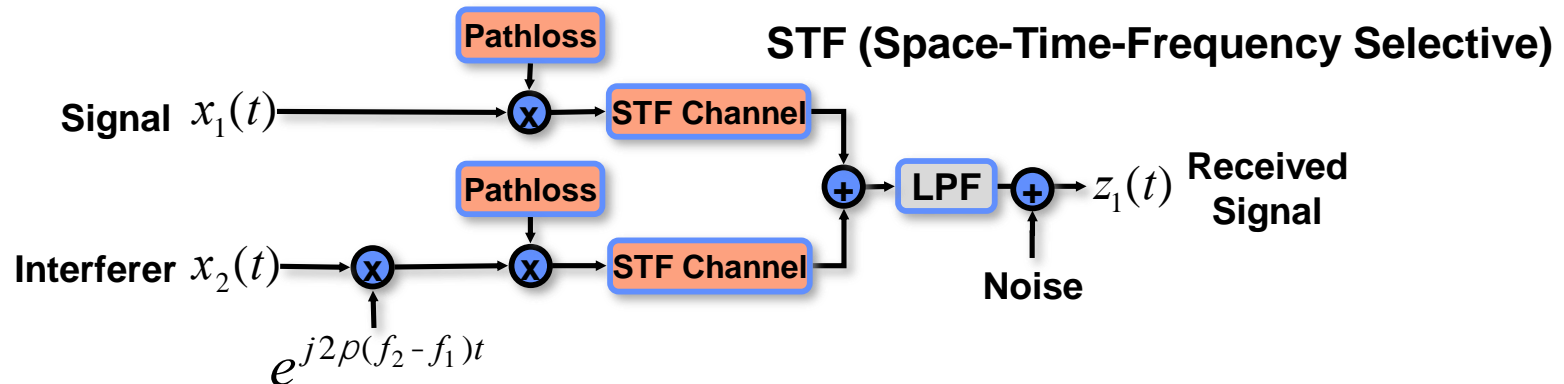


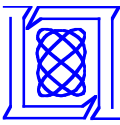
# Signal Representation

- Passband Model

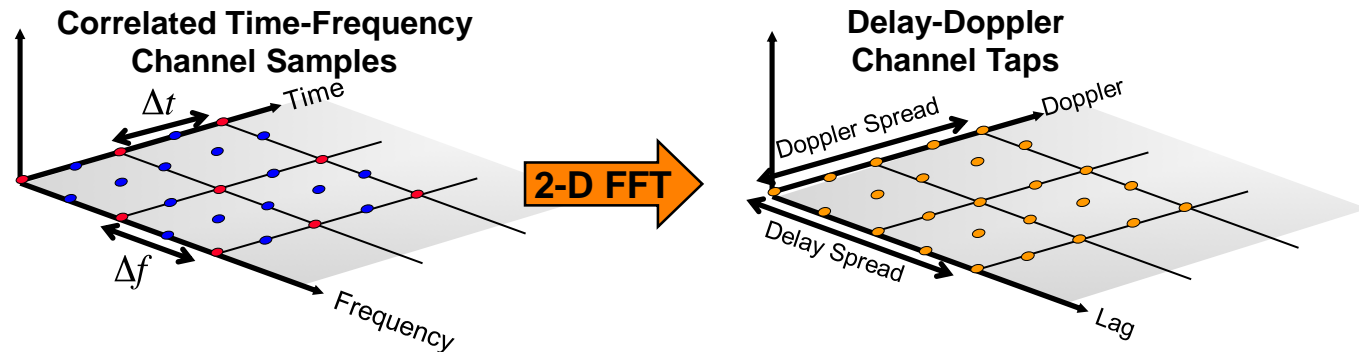


- Baseband Equivalent Model Used by LLAMAComm

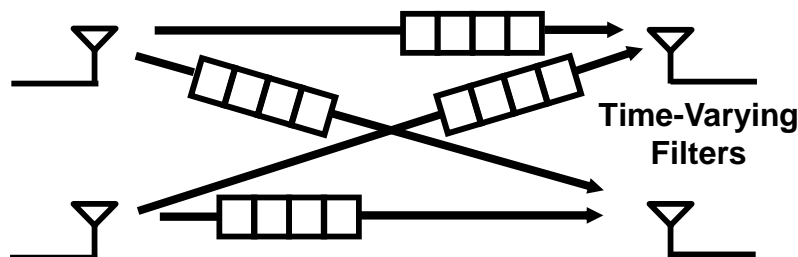




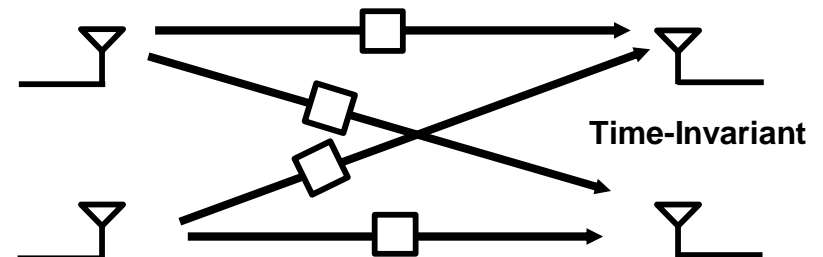
- **‘STFCS’ (Space-time-frequency-correlated scattering)**
  - Preserves spatial correlation

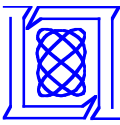


- **‘WSSUS’**
  - Wide-sense stationary uncorrelated scattering
  - Exponential power profile

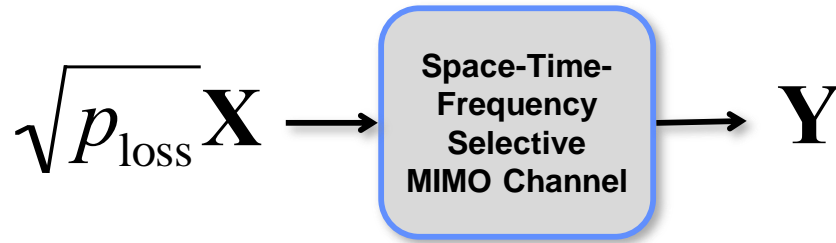


- **‘LOS\_AWGN’**
  - Line-of-sight path loss in AWGN channel
  - For debugging only





# ‘STFCS’ channel model option



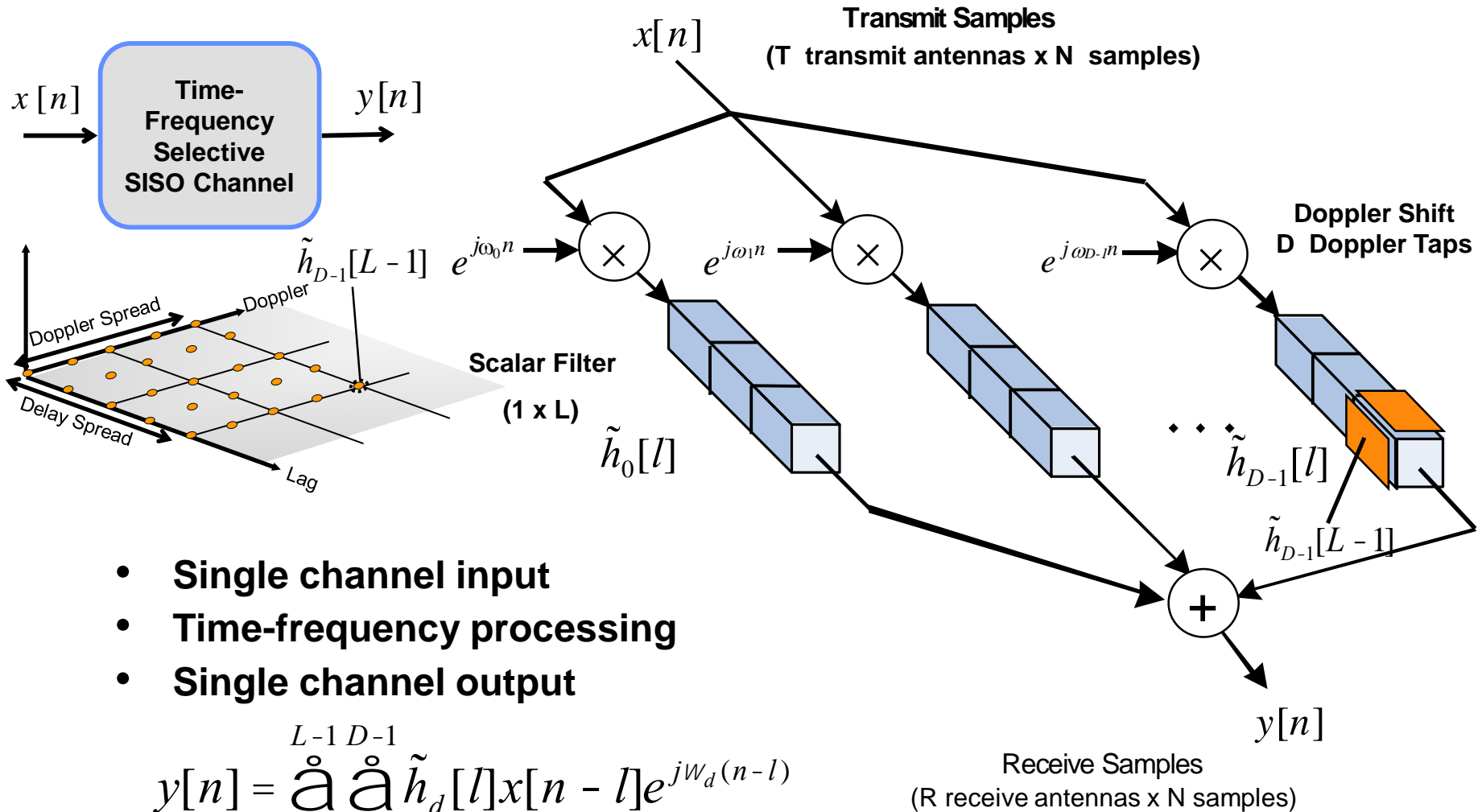
- ‘STFCS’ channel model was developed at Lincoln
  - Correlates signals over space, time, and frequency
- The STFCS channel tensor is four dimensional:

$$R \times T \times D \times L$$

- R receive antennas
- T transmit antennas
- D Doppler taps
- L lag taps



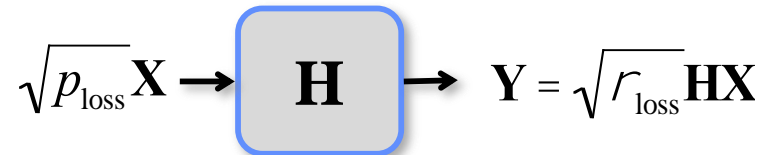
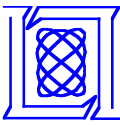
# SISO Channel with Doppler and Multipath



- Single channel input
- Time-frequency processing
- Single channel output

$$y[n] = \sum_{l=0}^{L-1} \sum_{d=0}^{D-1} \tilde{h}_d[l] x[n-l] e^{j\omega_d(n-l)}$$





- **Spatially correlated static MIMO channel:**

$$\mathbf{H} = \mathbf{U} \mathbf{A}_a \mathbf{G} \mathbf{A}_a \mathbf{V}^H$$

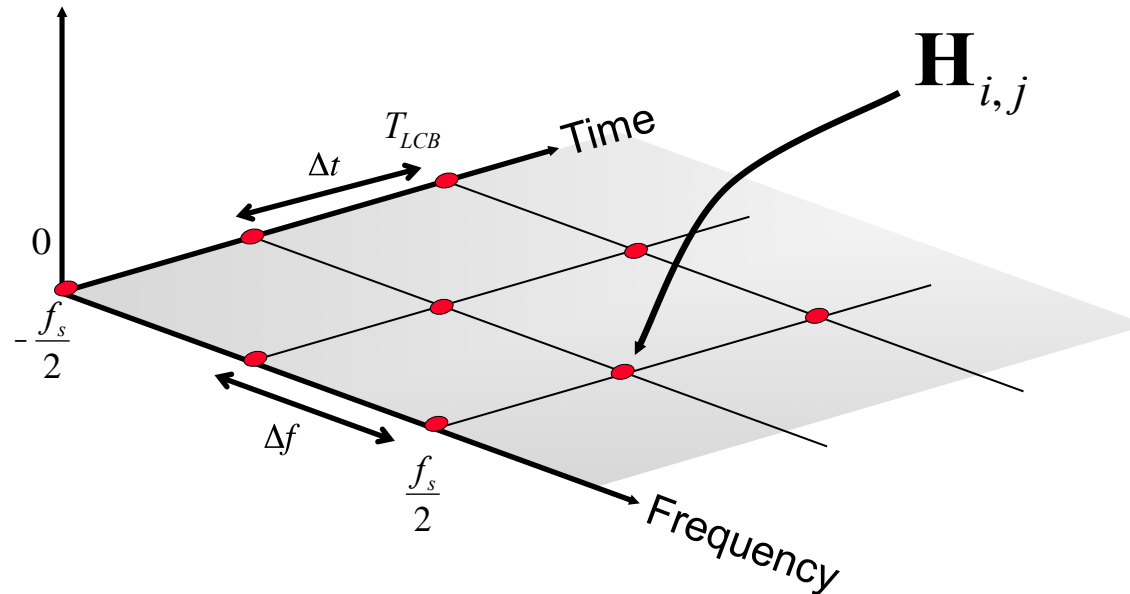
- **G is an  $R \times T$  i.i.d. Gaussian matrix**
- **U and V are random unitary matrices**
- **$\alpha$  controls spatial correlation**

$$\mathbf{A}_a = \begin{bmatrix} a^0 & & 0 \\ & \ddots & \\ & & a^{n-1} \end{bmatrix} \quad 0 \leq a \leq 1$$

- **What about MIMO channels with Doppler and Multipath?**
  - **Create time-frequency-space correlations**



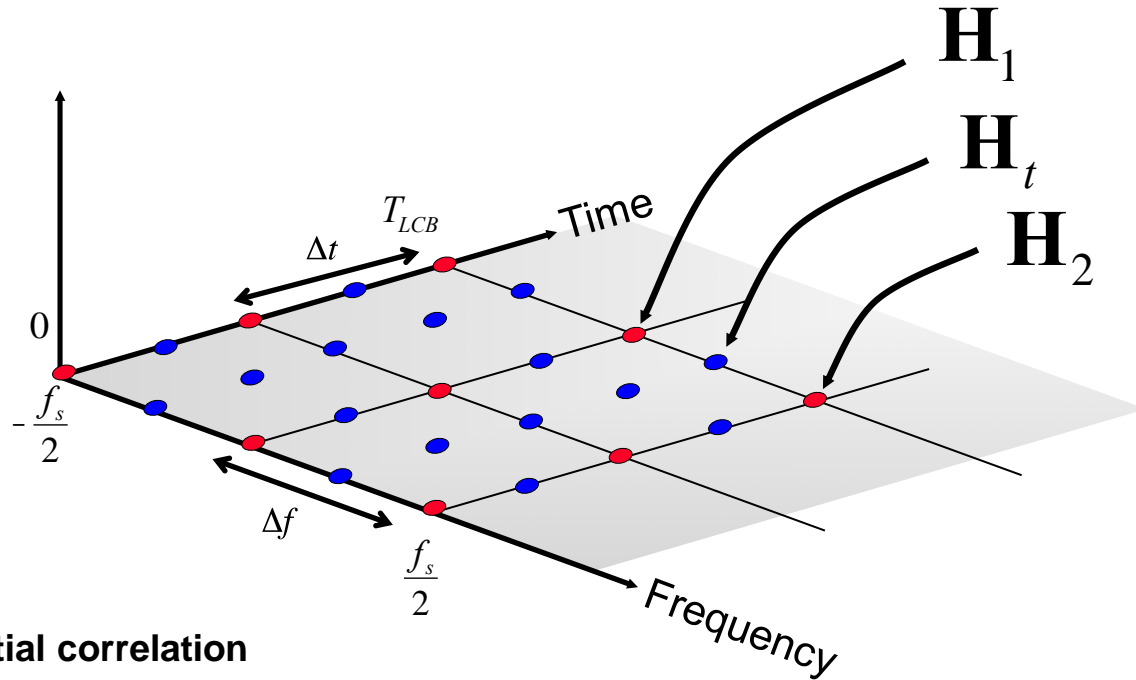
# Sample the Time-Frequency Plane



- $\Delta t$  coherence time
- $\Delta f$  coherence bandwidth
- Different  $H_{i,j}$ 's are uncorrelated with each other
- Each  $H_{i,j}$  is spatially correlated
- $T_{LCB}$  is longest coherent block (environment property)



# Interpolate the Time-Frequency Plane

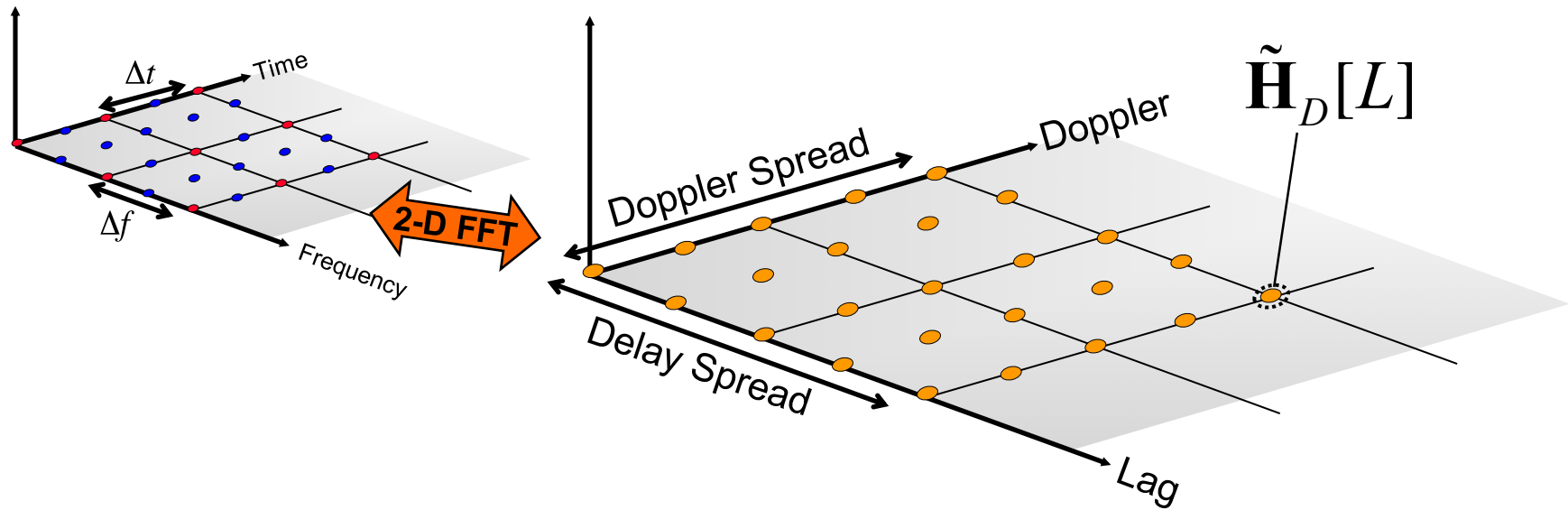


- Preserve spatial correlation

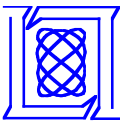
$$\begin{aligned}
 \mathbf{H}_1 &= \mathbf{U}_1 \mathbf{A}_a \mathbf{G}_1 \mathbf{A}_a \mathbf{V}_1 \\
 \mathbf{H}_t &= \mathbf{U}_t \mathbf{A}_a \mathbf{G}_t \mathbf{A}_a \mathbf{V}_t \\
 \mathbf{H}_2 &= \mathbf{U}_2 \mathbf{A}_a \mathbf{G}_2 \mathbf{A}_a \mathbf{V}_2
 \end{aligned}
 \left\{ \begin{aligned}
 \mathbf{U}_t &= \mathbf{U}_1 e^{t \log \mathbf{U}_1^H \mathbf{U}_2} \\
 \mathbf{G}_t &= \sqrt{1 - t^2} \mathbf{G}_1 + t \mathbf{G}_2 \\
 \mathbf{V}_t &= \mathbf{V}_1 e^{t \log \mathbf{V}_1^H \mathbf{V}_2}
 \end{aligned} \right.$$



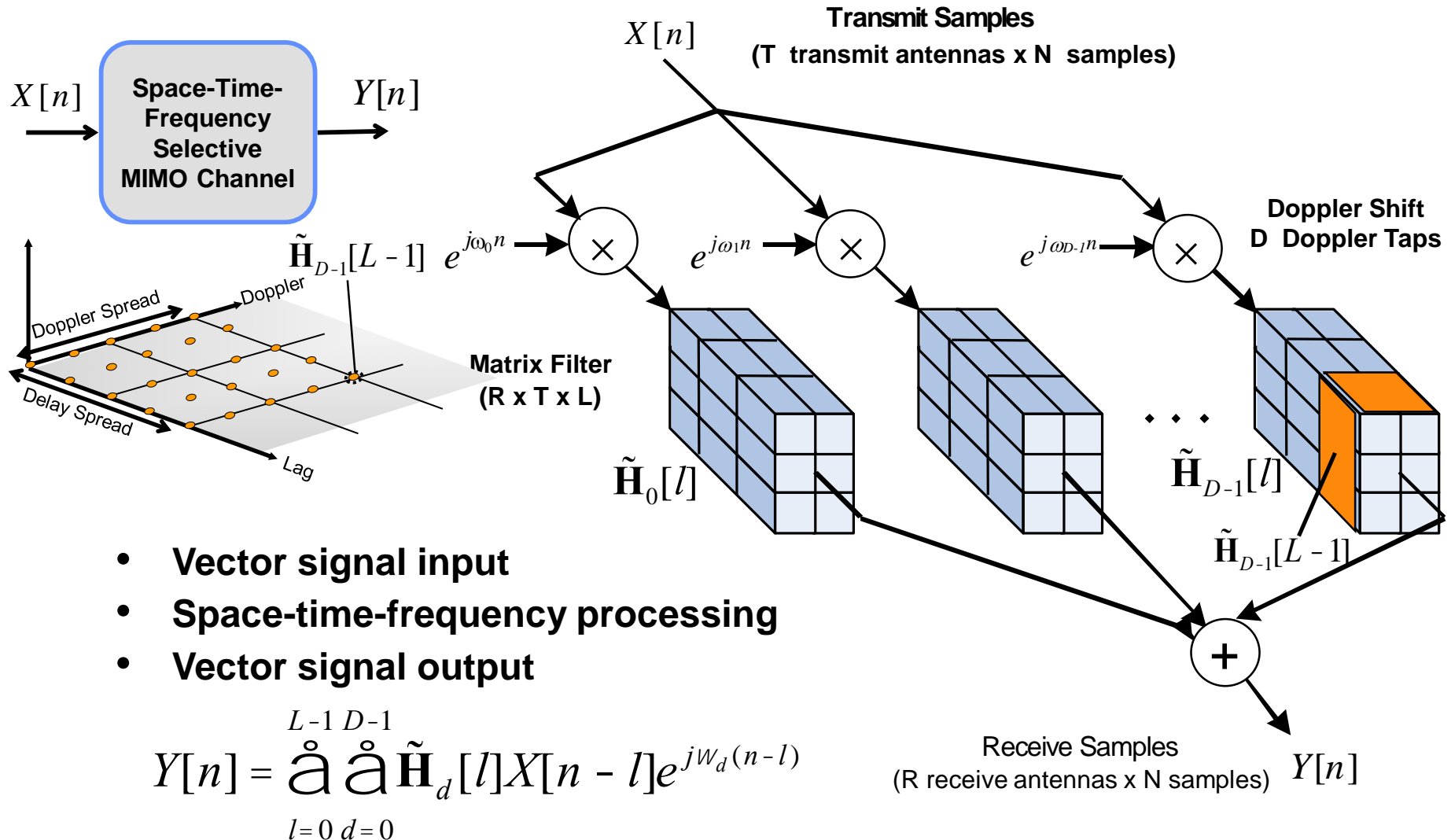
# Convert to Doppler-Lag Plane



- Take 2-D FFT over each spatial component
  - Time  $\rightarrow$  Doppler
  - Frequency  $\rightarrow$  Lag



# MIMO Channel with Doppler and Multipath







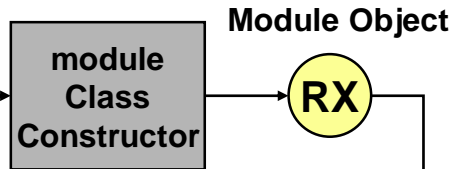
# Building a Node Object in LLAMAComm

LLAMA Comm

- Example: building a receiver node
- Note: A node can have any number of modules

## Module Properties

```
name = 'Receiver_module';  
callbackFcn = @receiver;  
fc = 850e6;  
type = 'receiver';  
antPosition = [0 -1 2 ...
```

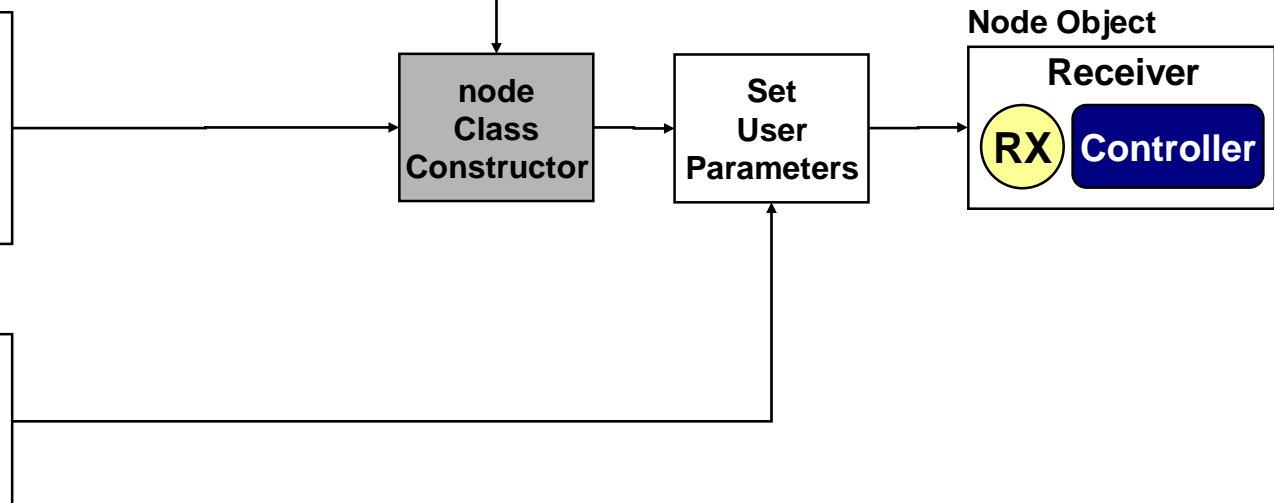


## Node Properties

```
name = 'Receiver_node';  
location = [0 0 10];  
velocity = [0 0 0];  
controllerFcn = @Controller;  
...
```

## User Parameters

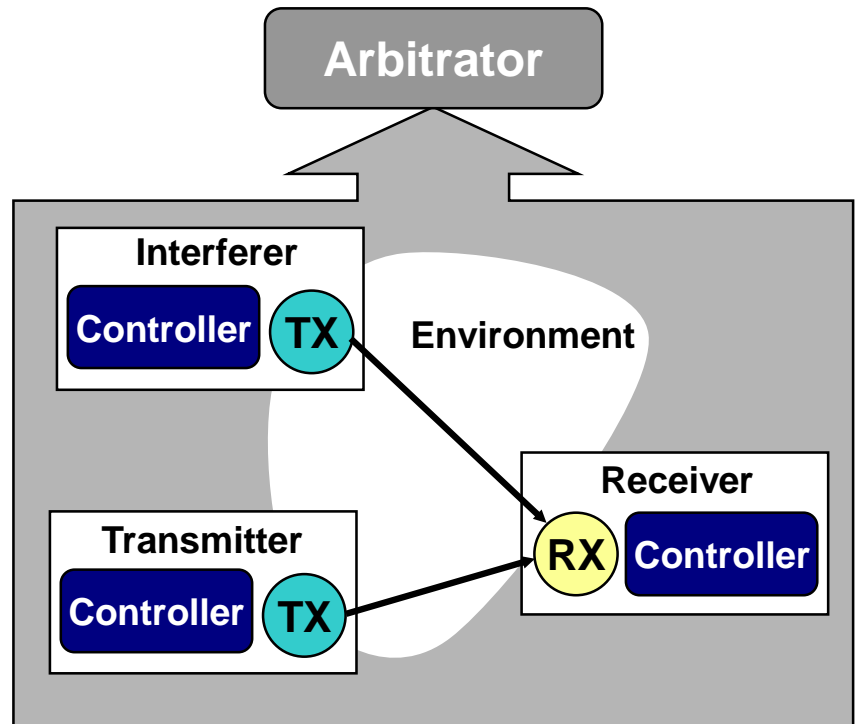
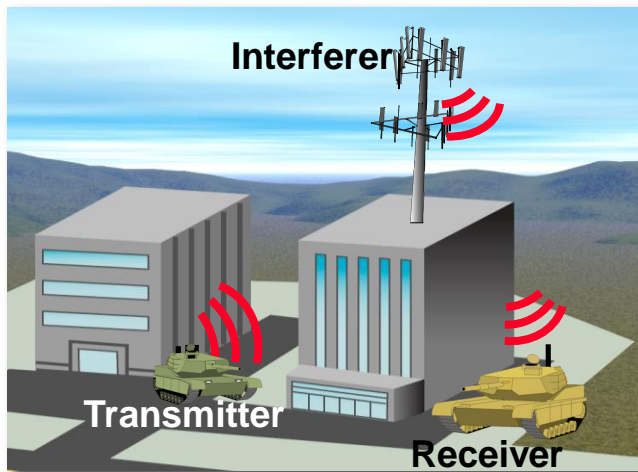
```
observedBlocks = 0;  
nBlocksToObserve = 10;  
blockLength = 5000;  
...
```

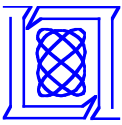




# Simulation Procedure

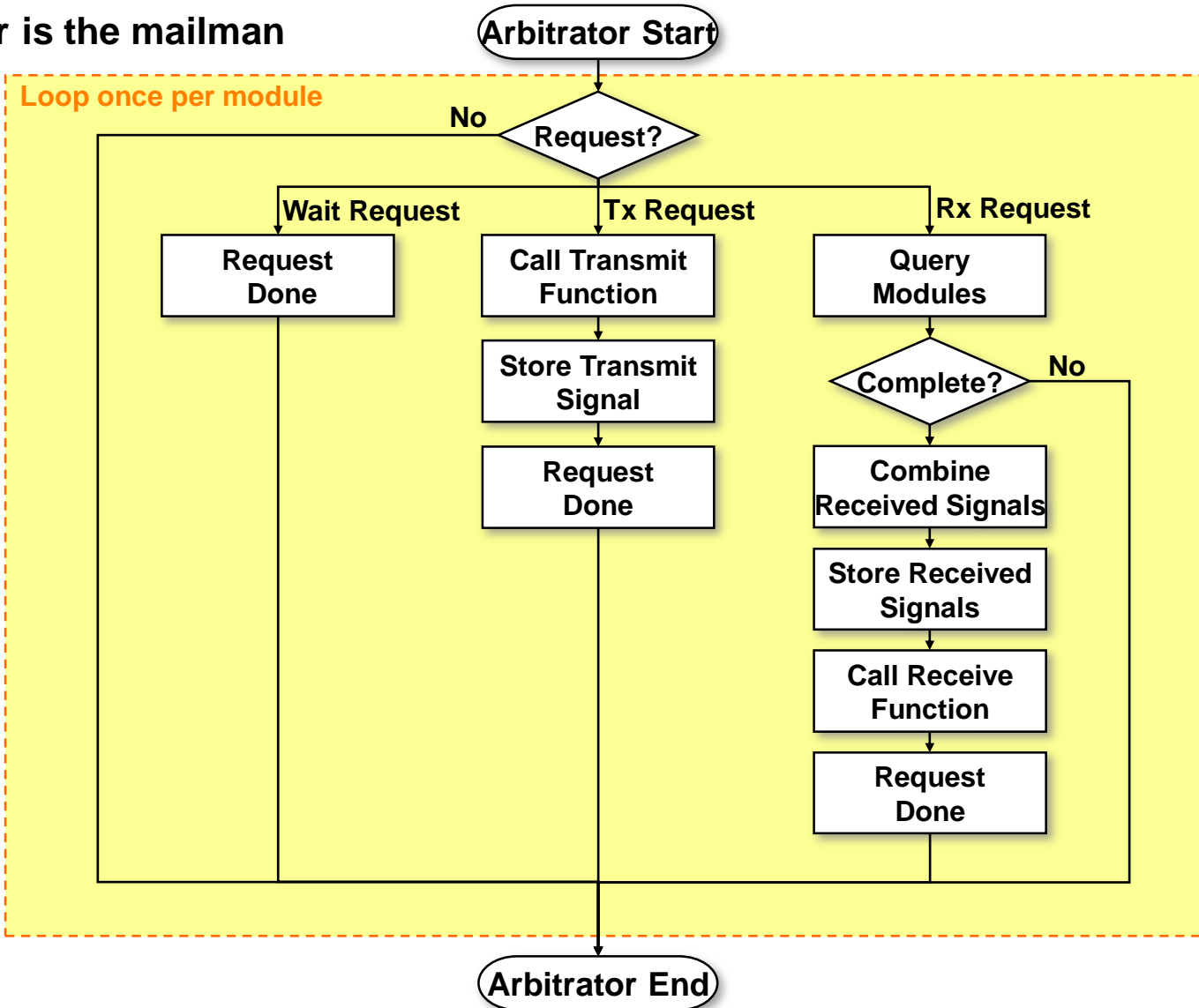
1. Controllers request to transmit and receive
2. Arbitrator enforces causality
3. Go to step 1.





# Flowchart of the Arbitrator

Arbitrator is the mailman





# Receiver Controller State Machine

## Text Color Key:

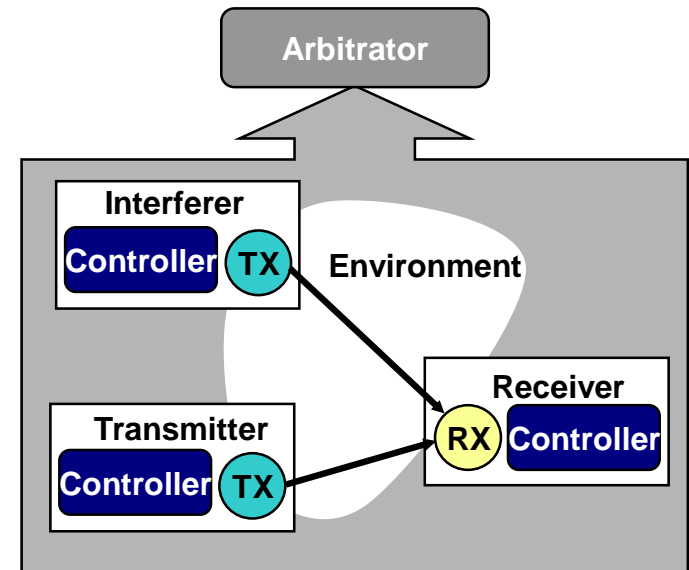
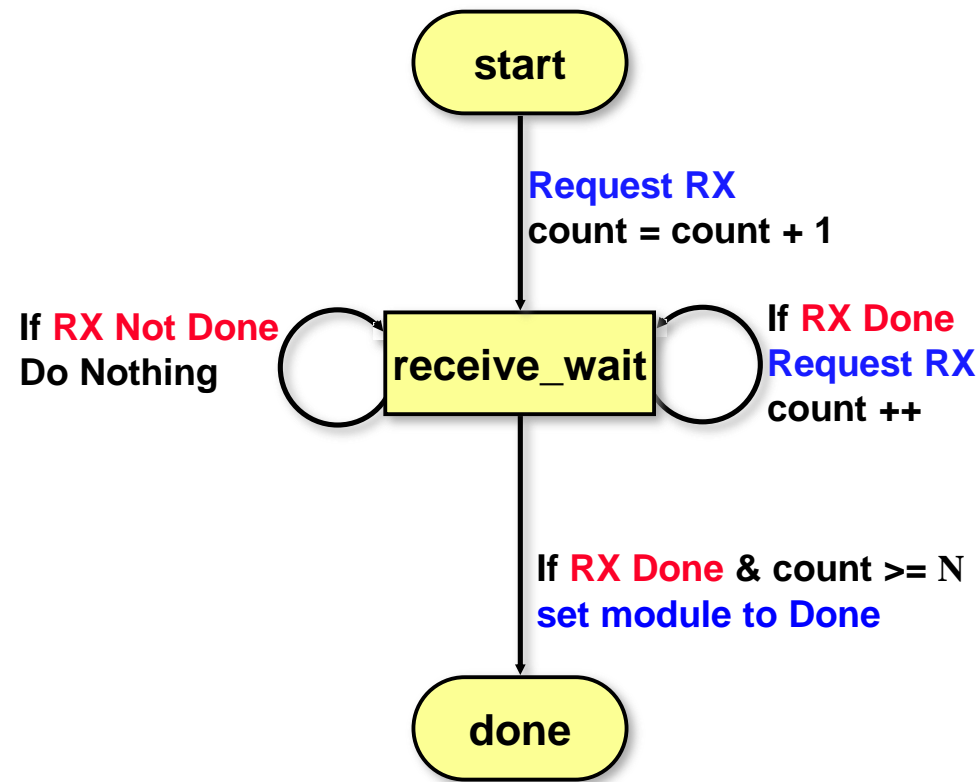
Red: Input from Arbitrator

Blue: Request

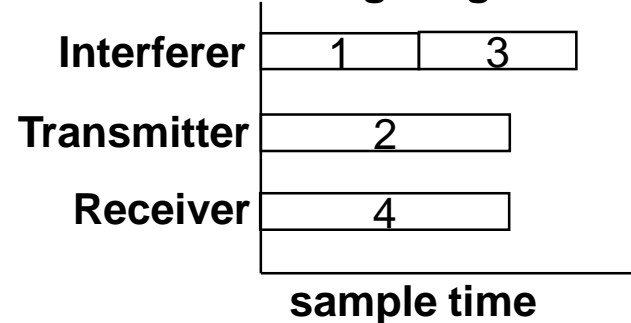
Black: Inline Code

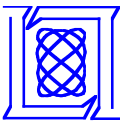
## Functionality:

Receive N sample blocks



## Timing Diagram





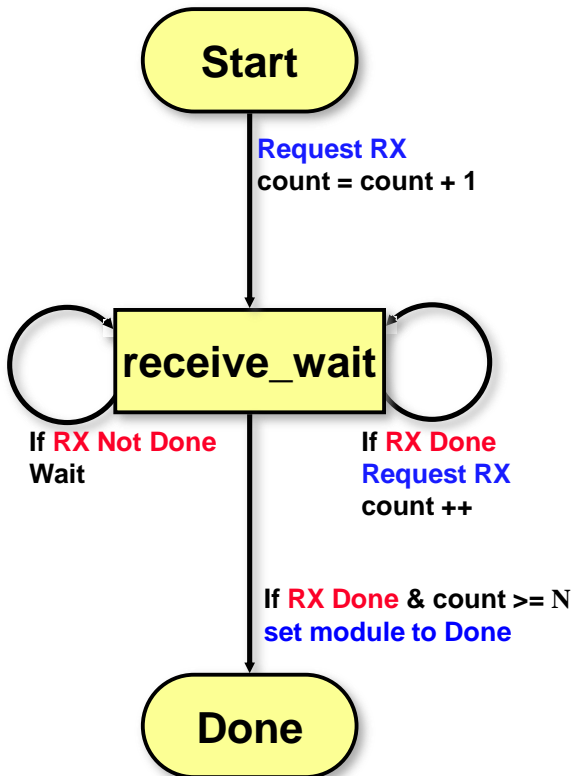
# Receiver Controller Matlab Code

Text Color Key:

**Red:** Input from Arbitrator

**Blue:** Request

**Black:** Inline Code



```

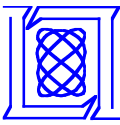
p           = GetUserParams(nodeobj);           % Load the user parameters
currState   = GetNodeState(nodeobj);           % Load the current state
switch currState
case 'start'
    nodeobj = SetModuleRequest(nodeobj,'observer_rx','receive',p.blockLen);
    p.observedBlocks = p.observedBlocks + 1;
    nextState = 'receive_wait';

case 'receive_wait'
    requests = CheckRequestFlags(nodeobj); % Get request flag
    if requests==0 % if RX Done
        if p.observedBlocks>=p.nBlocksToObserve;
            nodeobj = SetModuleRequest(nodeobj,'observer_rx','done');
            nextState = 'done';
        else % Receive another block and increment counter
            nodeobj ...
                = SetModuleRequest(nodeobj,'observer_rx','receive',p.blockLen);
            p.observedBlocks = p.observedBlocks + 1;
            nextState = 'receive_wait';
        end
    else % Wait until block has been received
        nextState = 'receive_wait';
    end

case 'done'
    nextState = 'done'; % Continue in Done state
    status = 'done';

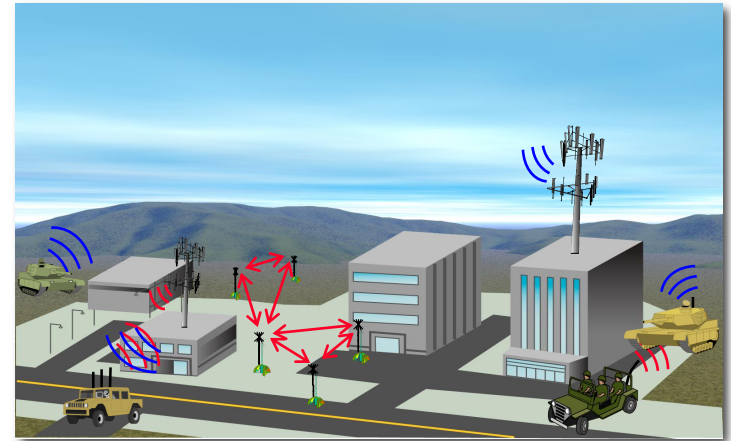
end
nodeobj = SetNodeState(nodeobj,nextState);
nodeobj = SetUserParams(nodeobj,p)
  
```

% Set the next state  
% Set the user parameters  
MIT Lincoln Laboratory

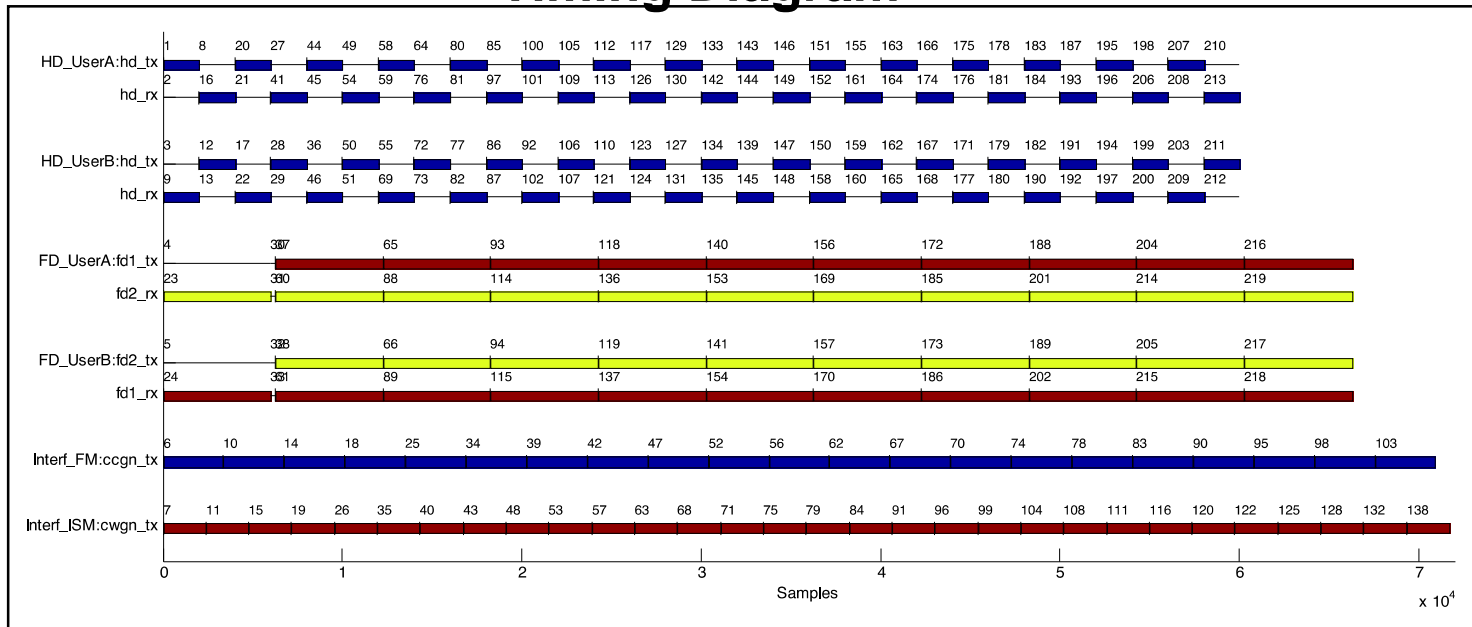


# Timing Diagram

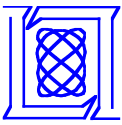
- LLAMAComm produces a timing diagram to simplify debugging
- Each segment represents a transmit or receive sample block
- Thin segments represent 'wait' blocks



## Timing Diagram

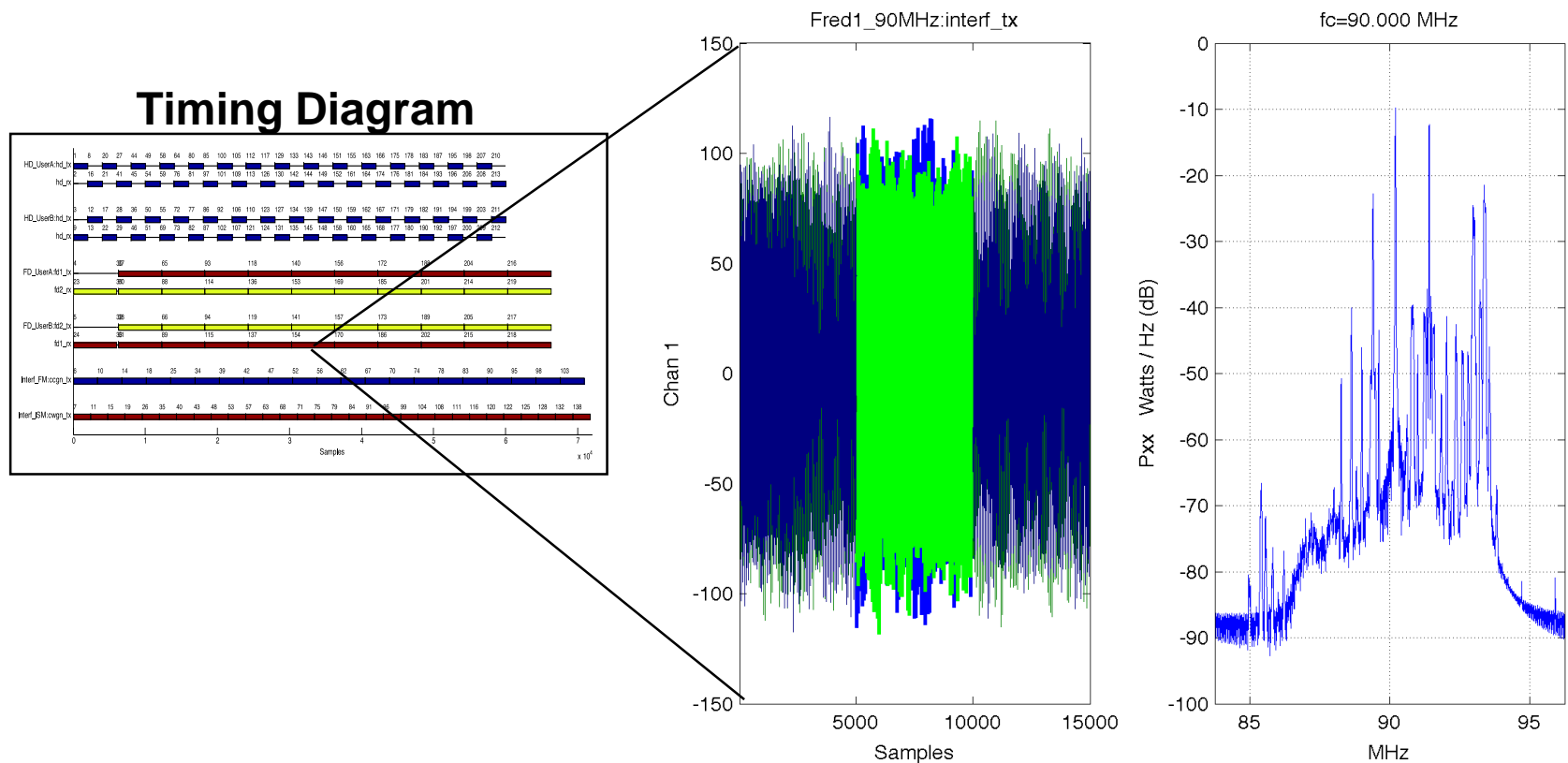






# Timing Diagram Callback Plots

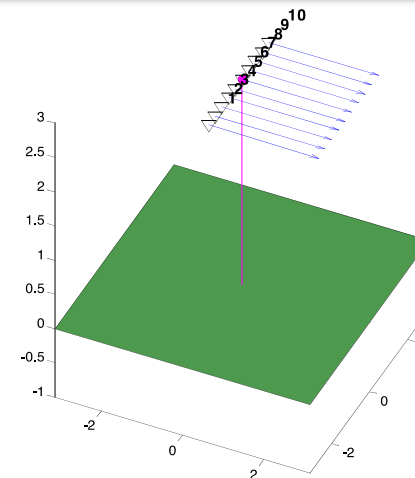
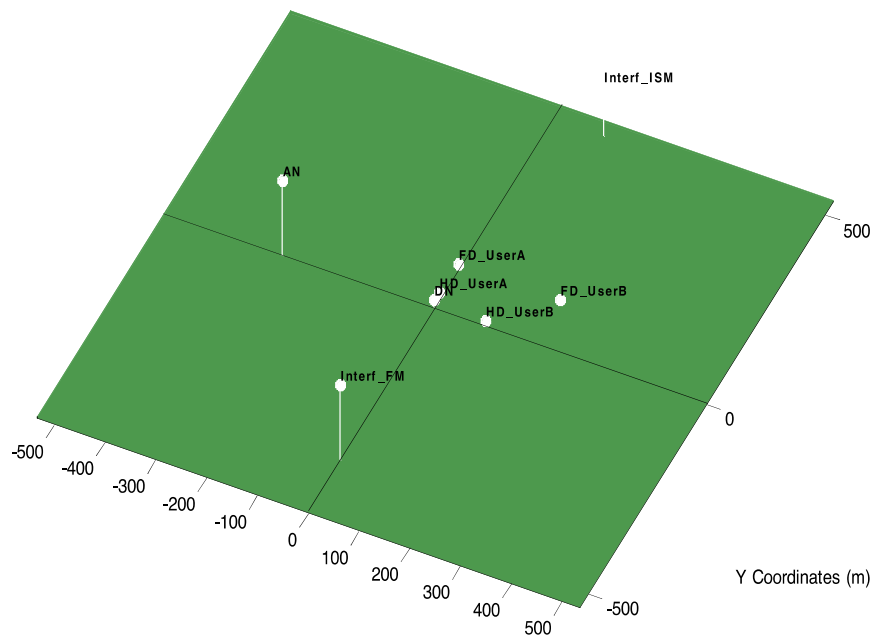
- Clicking on a segment produces a plot
- Plots can be customized by the user





# Node Position Map

- LLAMAComm plots a map of node positions.
- Clicking on a node name will produce a plot of the antenna positions and look directions.





- **Ground-to-Air link path loss model update**
- **Nodes in Motion (long time scales)**
  - Time-varying path losses
- **Enhanced radio library**
  - Open source model?
- **Parallelism**
  - Parallel processing to reduce simulation time
- **Special interference modules that generate samples only when overlapping in frequency with a receive request**
- **Allow dynamic sampling rates**