

# Modeling Environmental Effects on Directionality in Wireless Networks

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# Outline

- 1 Radio Propagation Environments and Directional Antennas
  - Pretty Pictures
  - Measuring Effective Directionality
  - Accuracy of Current Models
- 2 Estimating Radio Propagation
  - Ray Tracing
  - Propagation Models
  - Directivity Models
- 3 Directivity and Propagation are not Orthogonal
  - What's Missing?
- 4 Modeling
  - Fitting Specific Environments
  - Fitting Types of Environments
  - Relating Signals to Environment Parameters

# RF Propagation Environments



# RF Propagation Environments



# Measurement Processes [1/2]

## Baseline Measurements

Calibration and test quality equipment (Agilent E4438C, 89600S VSG and VSA) used for:

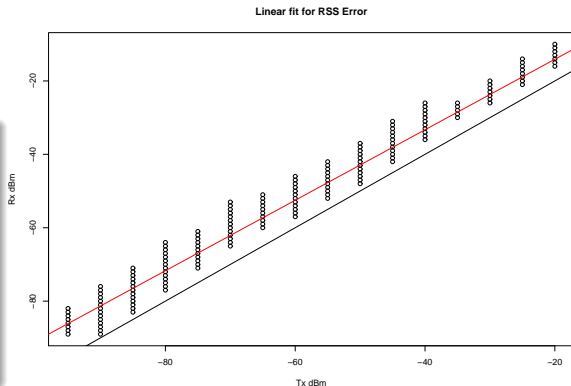
- Reference pattern
- Calibrating laptop measurements.



# Measurement Processes [2/2]

## Laptop Measurements

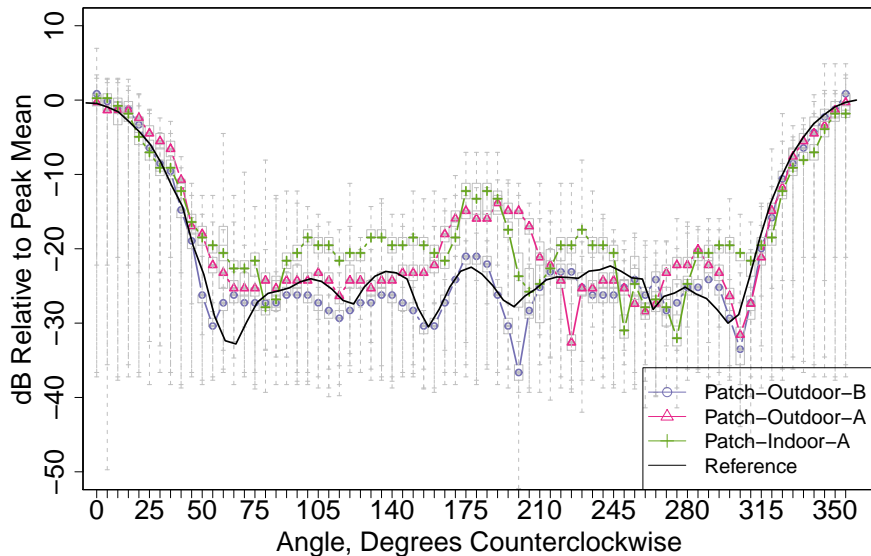
- Dell laptops
- Atheros AR5213 radios
- Used for non-reference measurements.



- Linear fit, slope  $\approx 0.95$
- Adjusted  $R^2 = 0.989$

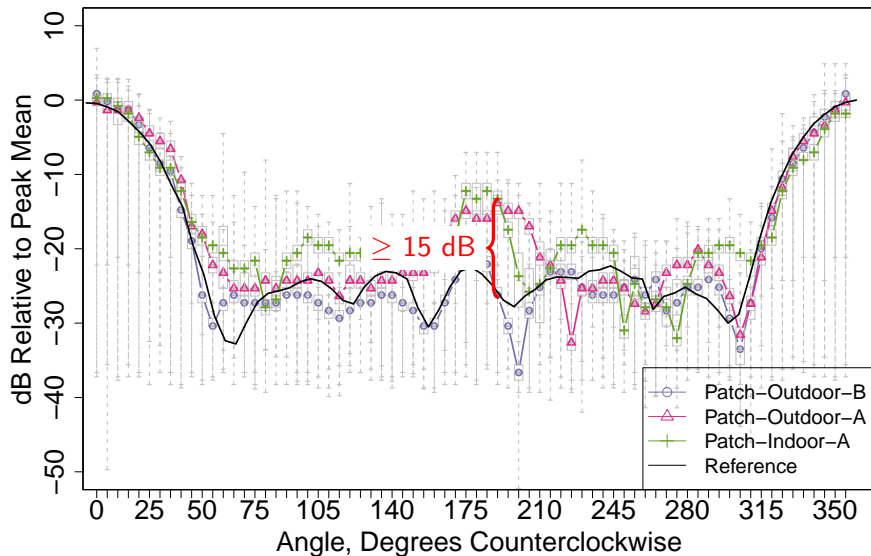
# How Bad is it?

## Patch-Panel Antenna



# How Bad is it?

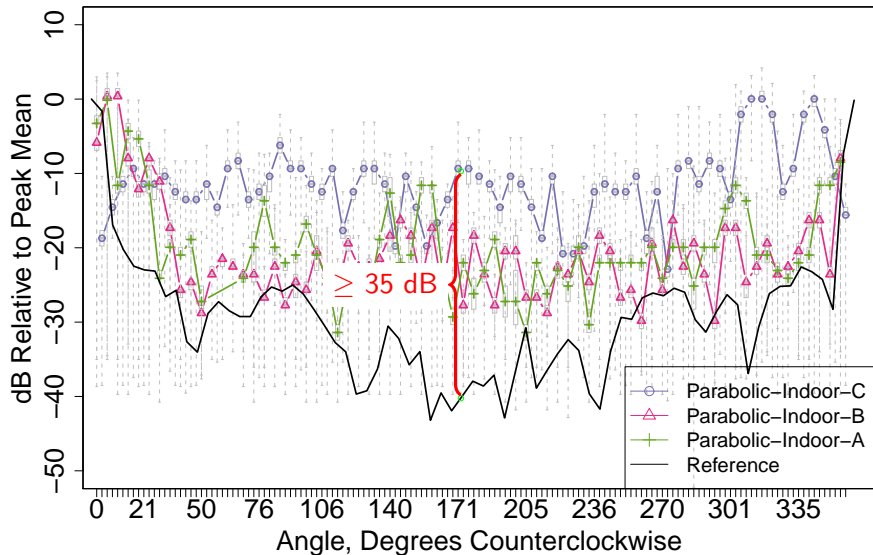
## Patch-Panel Antenna





# How Bad Is It?

## 24dBi Parabolic Dish, Indoors



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# Radio Ray Tracing



$$P_{rx} = P_{tx} \left| (f_a(\theta_1) f_b(\theta_2) d_1^{-2}) \right|$$

# Radio Ray Tracing

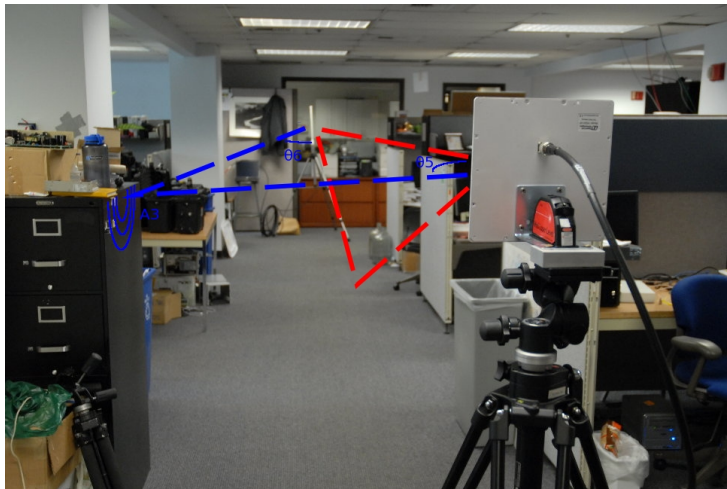


$$P_{rx} = P_{tx} \left| \left( f_a(\theta_1) f_b(\theta_2) d_1^{-2} + f_a(\theta_3) f_b(\theta_4) d_2^{-2} A_2 \right) \right|$$

“two-ray”



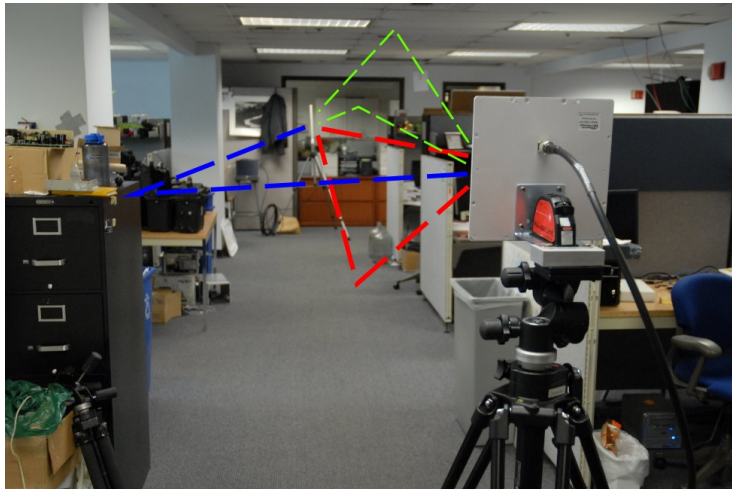
# Radio Ray Tracing



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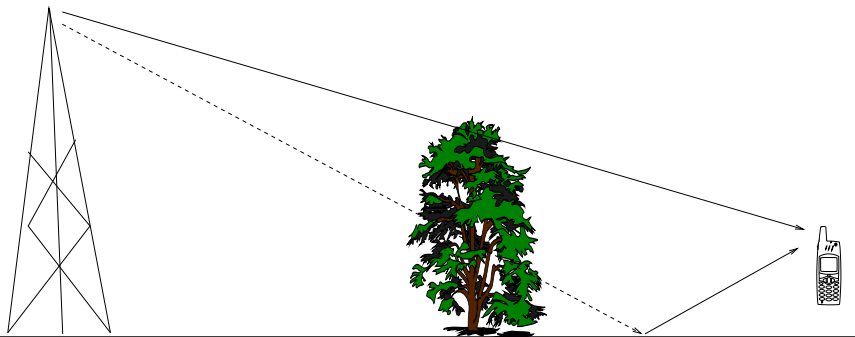
# Radio Ray Tracing



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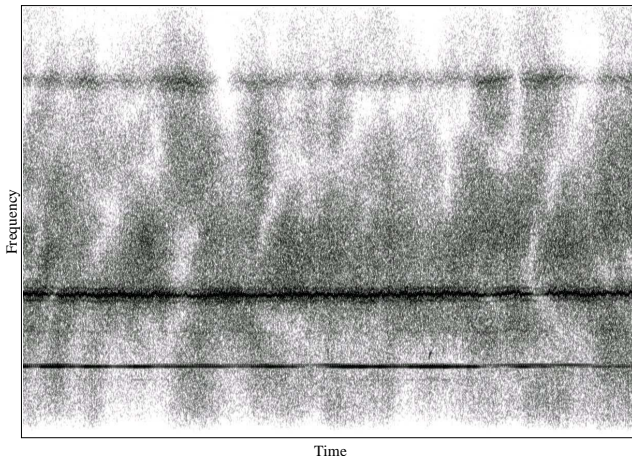
# Path Loss



Path loss: Macro-scale function of position & terrain.

e.g. Free space, two-ray, HATA/COST231, ITU238, ...

# Fading



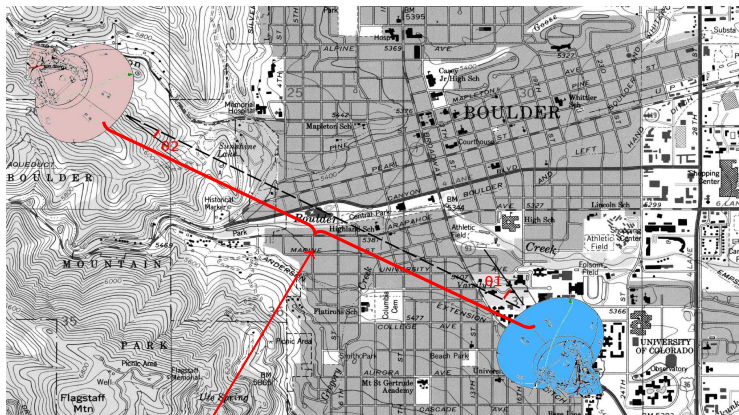
[Credit: Public domain image from Wikimedia commons]

Fading: Micro-scale function of *many* positions and velocities. Treated as function of time.

e.g. Rayleigh, Rician, Weibull, ...



# Directivity – Current Models

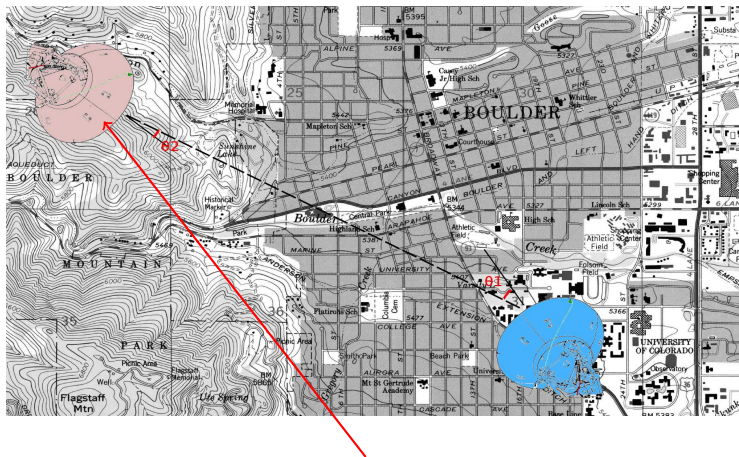


Fading & path loss    Node a gain    Node b gain

$$P_{RX} = P_{TX} * X * f_a(\theta_1) * f_b(\theta_2)$$



# Directivity – Current Models

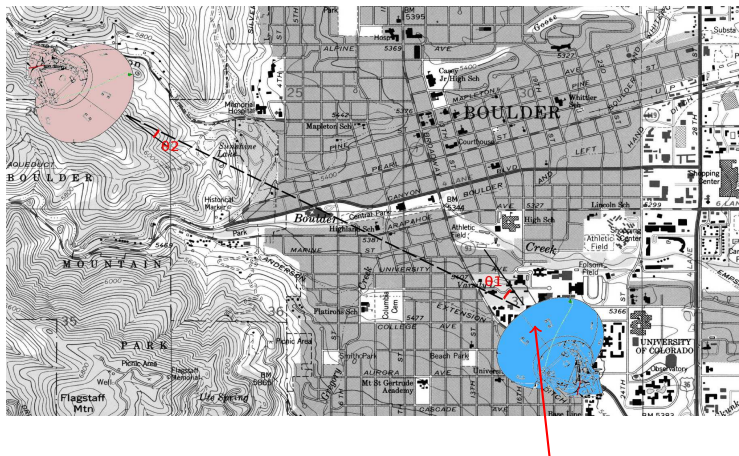


Fading & path loss   **Node a gain**   **Node b gain**

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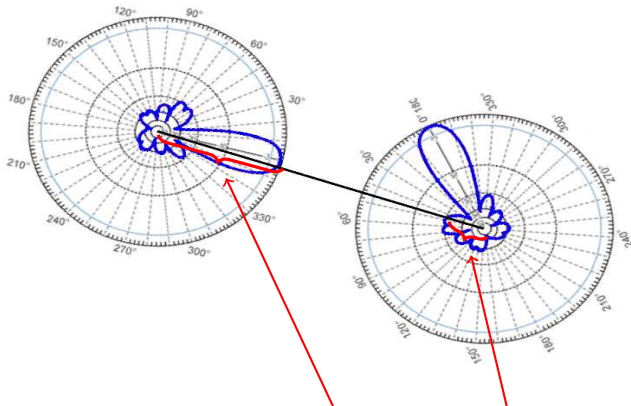
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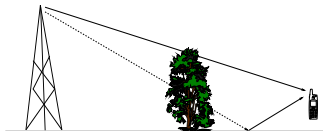
Fading & path loss   Node a gain   Node b gain

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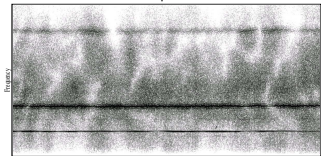
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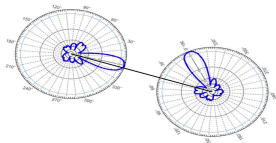
# Directivity – What's Missing?



+



+



= ?

Some  $f(\text{position}) * \text{Some } f(\text{time})$

$$P_{rx} = P_{tx} * X * f_a(\theta_1) * f_b(\theta_2)$$

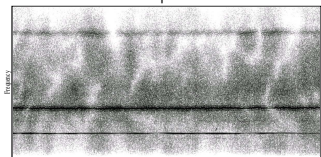
vs.

$$P_{rx} = P_{tx} * \left( \begin{array}{l} f_a(\theta_1) * f_b(\theta_2) * d_1^{-2} + \\ f_a(\theta_3) * f_b(\theta_4) * d_2^{-2} * A_2 + \\ f_a(\theta_5) * f_b(\theta_6) * d_3^{-2} * A_3 + \\ \dots \end{array} \right)$$

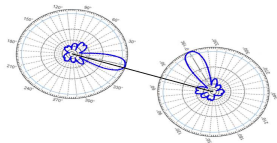
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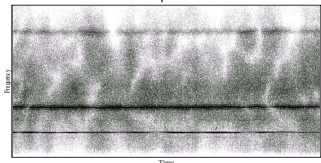
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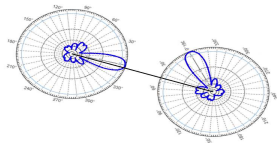
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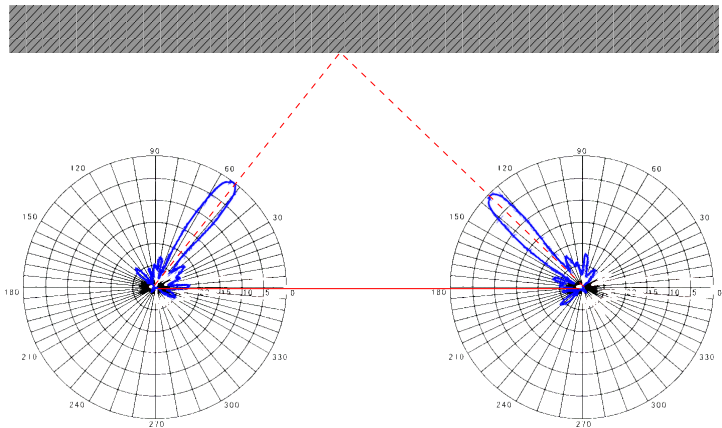
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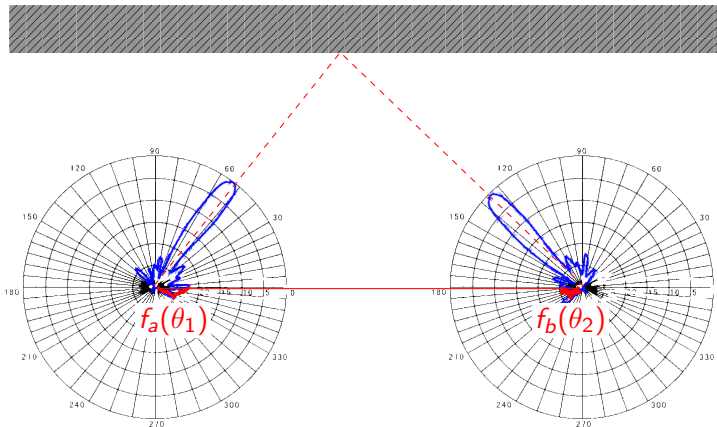
Antenna gain in “off” directions is ignored!



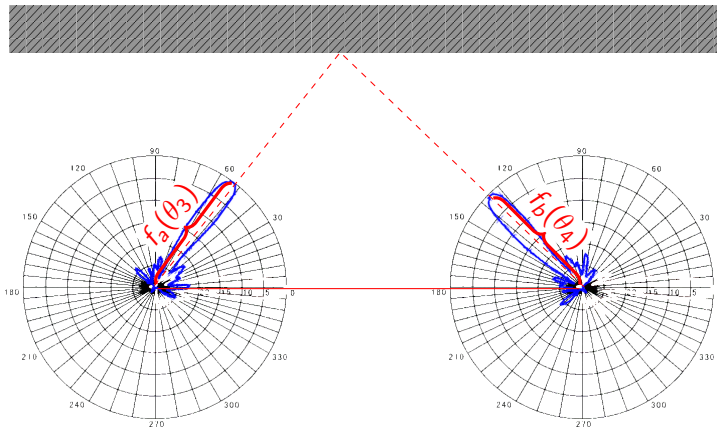
# An Obvious Problem



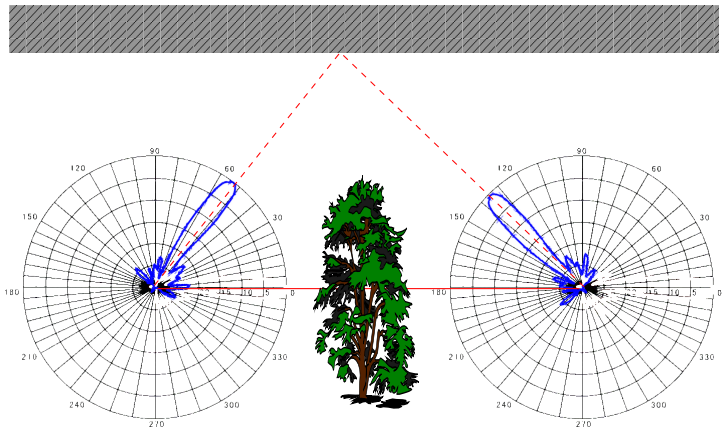
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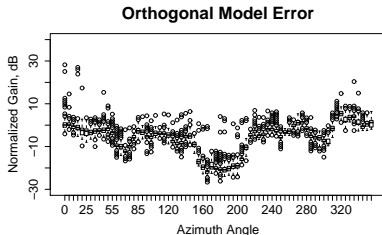
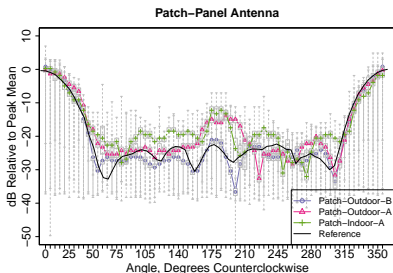
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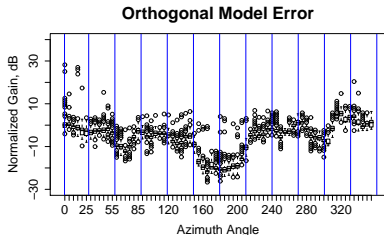
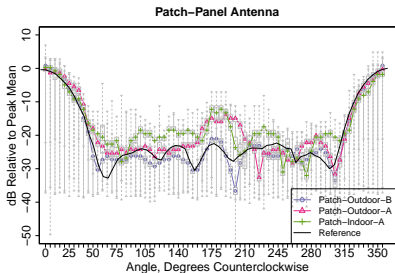
# Environment Fitting



## “Environment” = “Error”

- Error is correlated with angle
- Fit existing model error
  - Bin by angle
  - Find regression fit
- Characterizes specific link, antenna, environment.

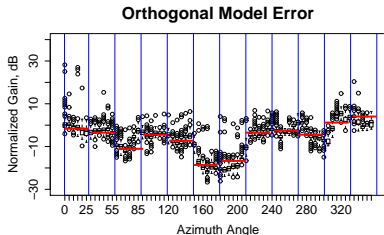
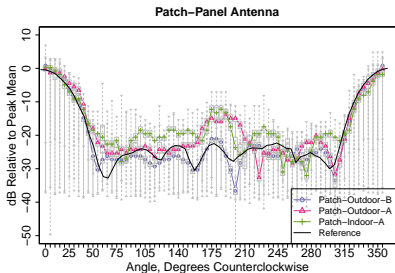
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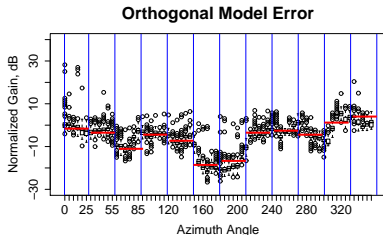
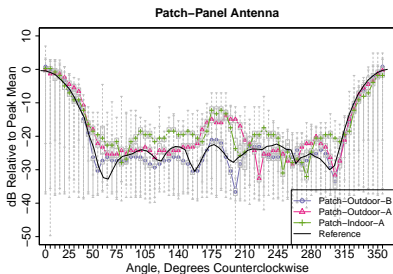


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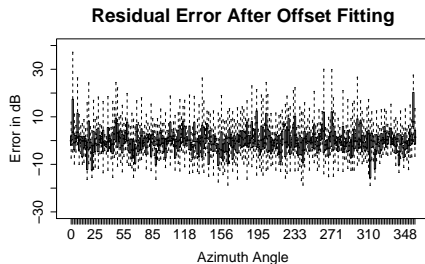
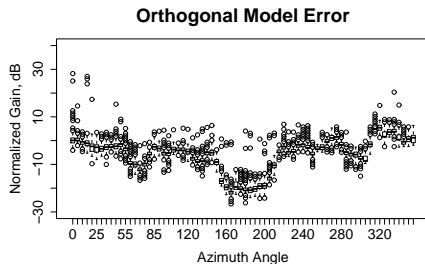
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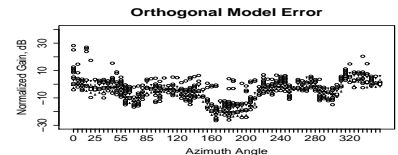
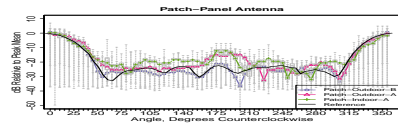
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# Error Comparison



# Types of Environments

Environment = set of offsets



e.g.  $\{-1, -2, -5, -2, \dots\}$

Group of environments =  
distribution of offsets

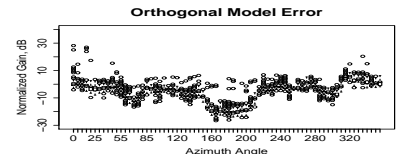
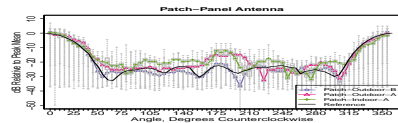
## Offset ANOVA

Variation is predicted by:

- “Type” of environment
- Antenna gain  $f(\theta_k)$
- Observation point (negligible)

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## Offset ANOVA

Variation is predicted by:

- “Type” of environment
- Antenna gain  $f(\theta_k)$
- Observation point (negligible)

Therefore

(Type, antenna gain)  $\Rightarrow$  offset distribution



# Environment Parameters

Antenna  $a$ , bin  $k$

Arc of azimuth centered at  $\theta_k$ . Fitted offset is  $Off_k$

$$E[Off_k] = f_a(\theta_k) * \text{gain coefficient}$$

$$Off_k \sim \text{Nor}(E[Off_k], \sigma(\text{offset}))$$

$$\text{Signal} \sim \text{Nor}(Off_k, \sigma(\text{signal}))$$

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Environment	$K_{gain}$	$S_{off}$	$S_{ss}$
Open Outdoor	0.01 - 0.04	1.326 - 2.675	2.68 - 3.75
Urban Outdoor	0.15 - 0.19	2.244 - 3.023	2.46 - 2.75
LOS Indoor	0.25 - 0.38	2.837 - 5.242	2.9 - 5.28
NLOS Indoor	0.67 - 0.70	3.17 - 3.566	3.67 - 6.69

**Table:** Summary of Regression Results: Gain-offset regression coefficient ( $K_{gain}$ ), offset residual std. error ( $S_{off}$ ), and signal strength residual std. error ( $S_{ss}$ ).



# Thank you

Contact:

[eric.anderson@colorado.edu](mailto:eric.anderson@colorado.edu)

Measurements:

<http://www.crowdad.org/cu/antenna>

Simulation software (Qualnet 4.5.1 patch):

<http://systems.cs.colorado.edu/>

# Bin Sizes

**Residual Error Relative to Bin Count  
(Individual Data Sets Overlaid on Box Plot)**

