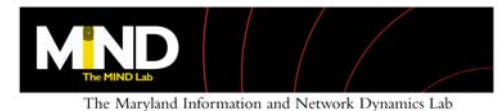


# Wireless Networking Projects

Ashok K. Agrawala

Udaya Shankar

University of Maryland



# Participants

- Ashok Agrawala
- Udaya Shankar
- Moustafa Youssef
- Students
  - Adel
  - Jihwang
  - Tamer
  - Andre
  - Arun
  - Bao
  - ...



# Activities

- Location Determination
  - Adhoc
    - PinPoint and Extensions
  - Infrastructure Based
    - Horus Technology
    - Nuzzer Technology for passive determination of location
- Energy Efficient On-Demand Routing
- Enhancements to DCF
  - BEB in 802.11 in Noisy Environment
  - Location Aware Enhancements
- WiFi Traffic Characterization



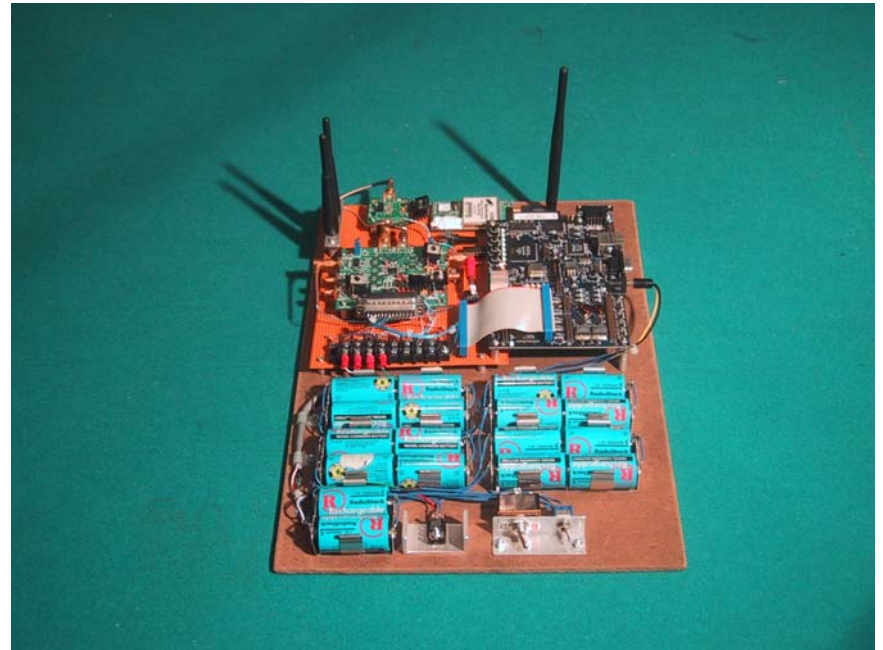
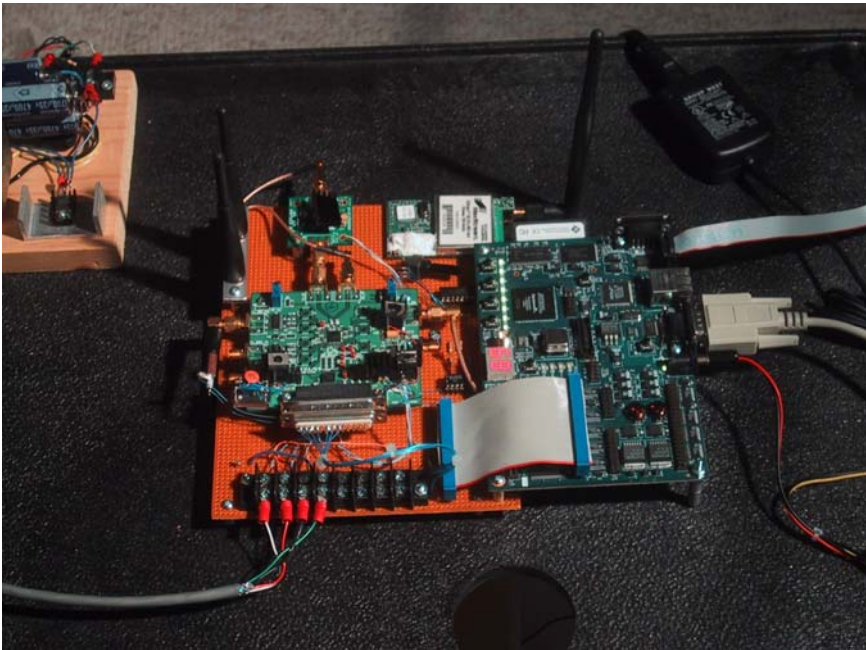
# Location Determination in AdHoc Environments

- There is no infrastructure
- There are no anchors – nodes with known locations
- Need to determine the range – distance between two nodes
  - PinPoint Technology
- Integrated view
  - SALAM – A Scalable Anchor-free Location Algorithm for a heterogeneous Network



# PinPoint

## Current Hardware – Client node

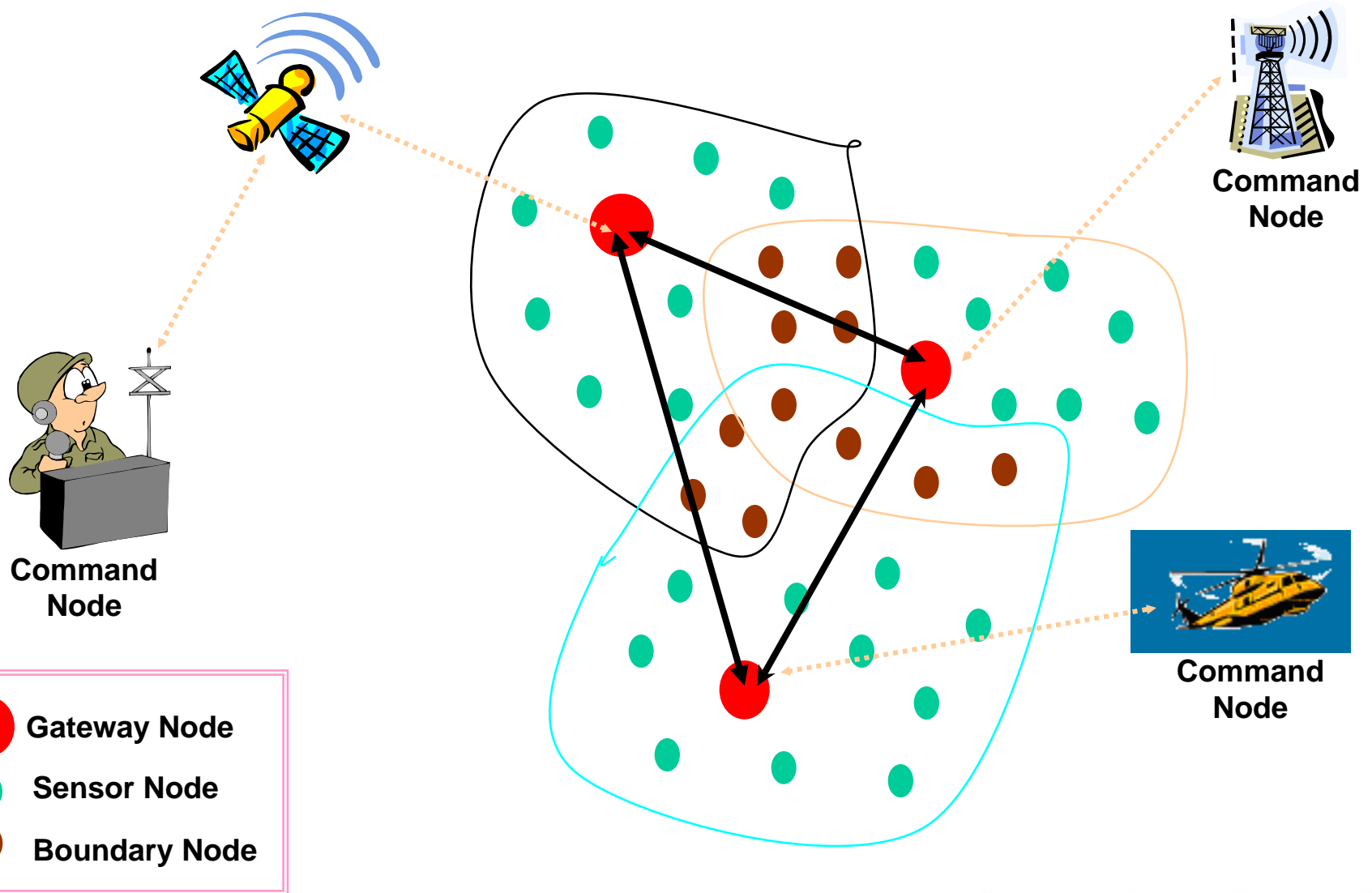


- **Locally centralized algorithms scale well with increased network size**
- **They are robust to network partitioning and node failure.**
- **They can achieve acceptable accuracy compared to a centralized approach.**

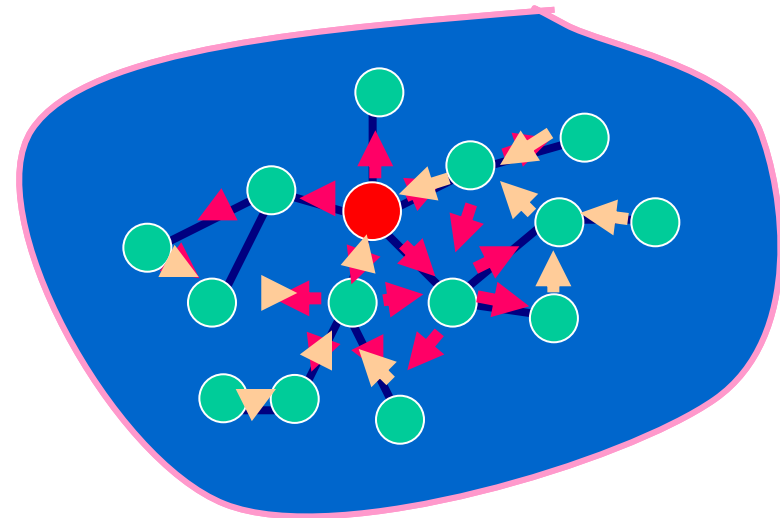
**A locally centralized algorithm should be a good compromise between accuracy, communication overhead, depending on the size of the cluster and the location of the cluster head.**

# SALAM

## System Architecture



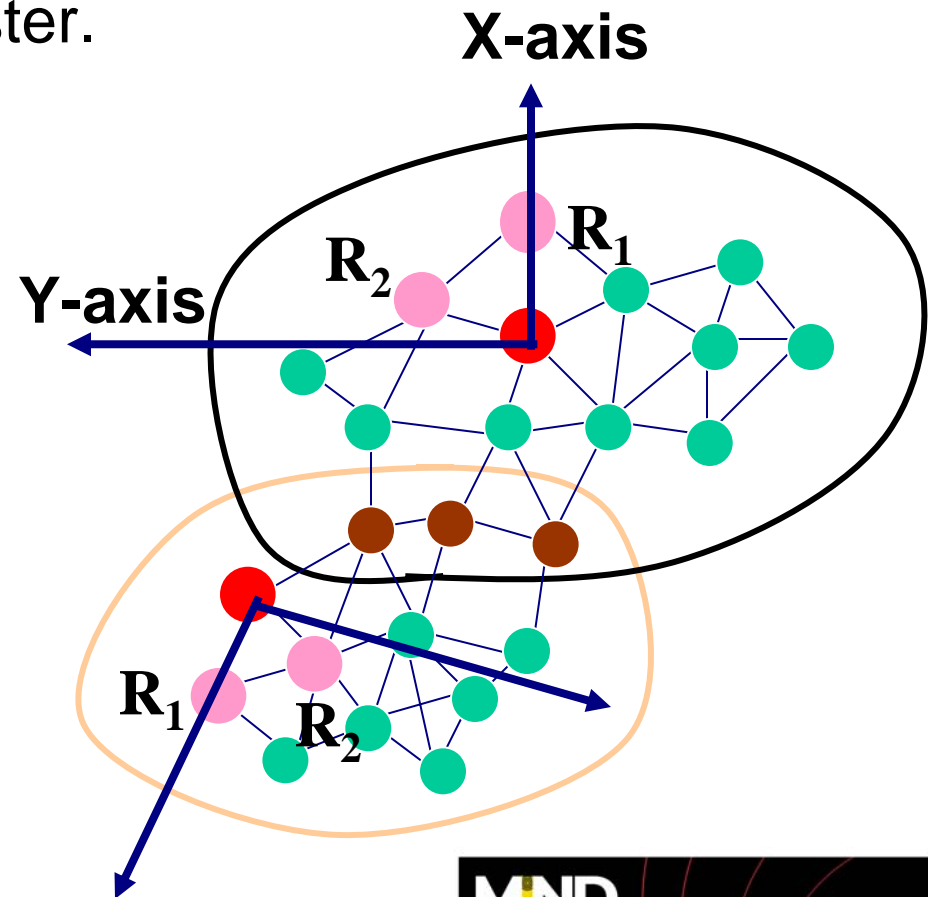
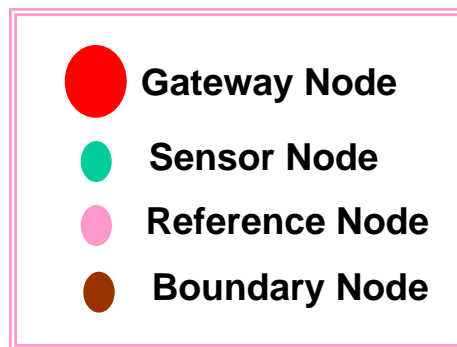
- Range Estimation - PinPoint
  - Node Discovery
    - Discover nodes that are  $K$ -hops (cluster radius) away from gateway node.
    - Build a breadth first spanning tree rooted at the gateway node.
  
- Cluster Formation





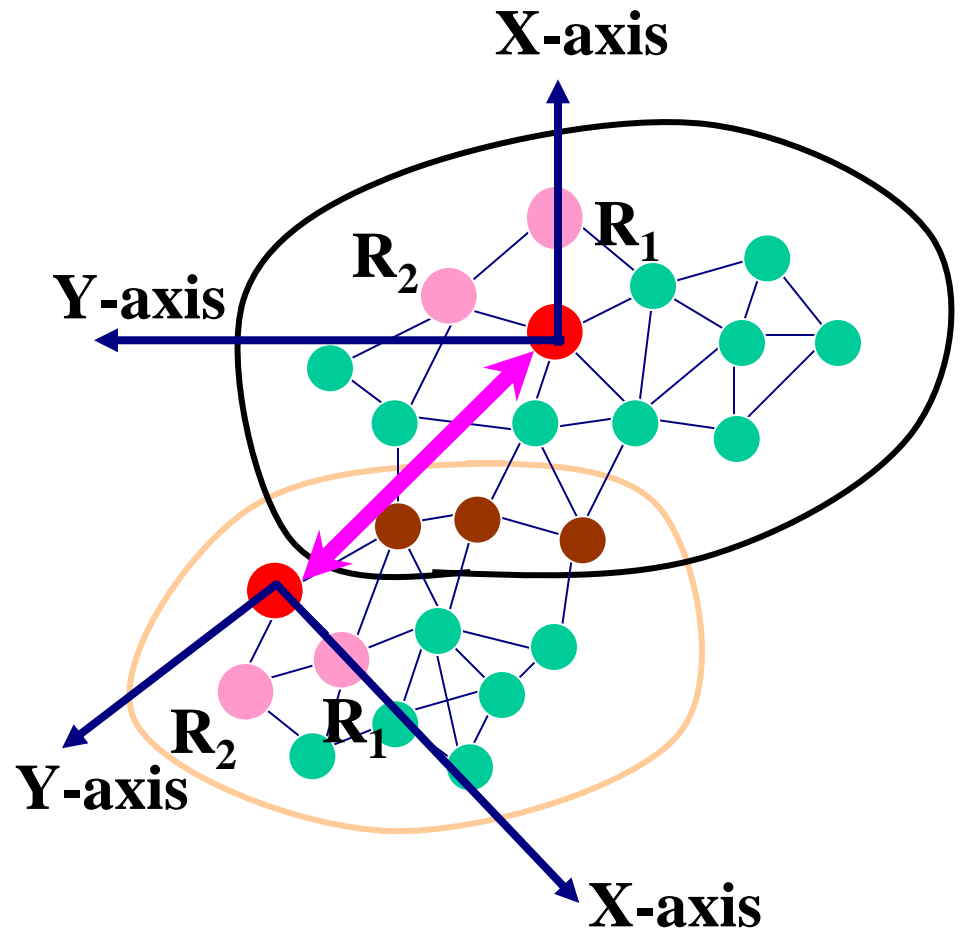
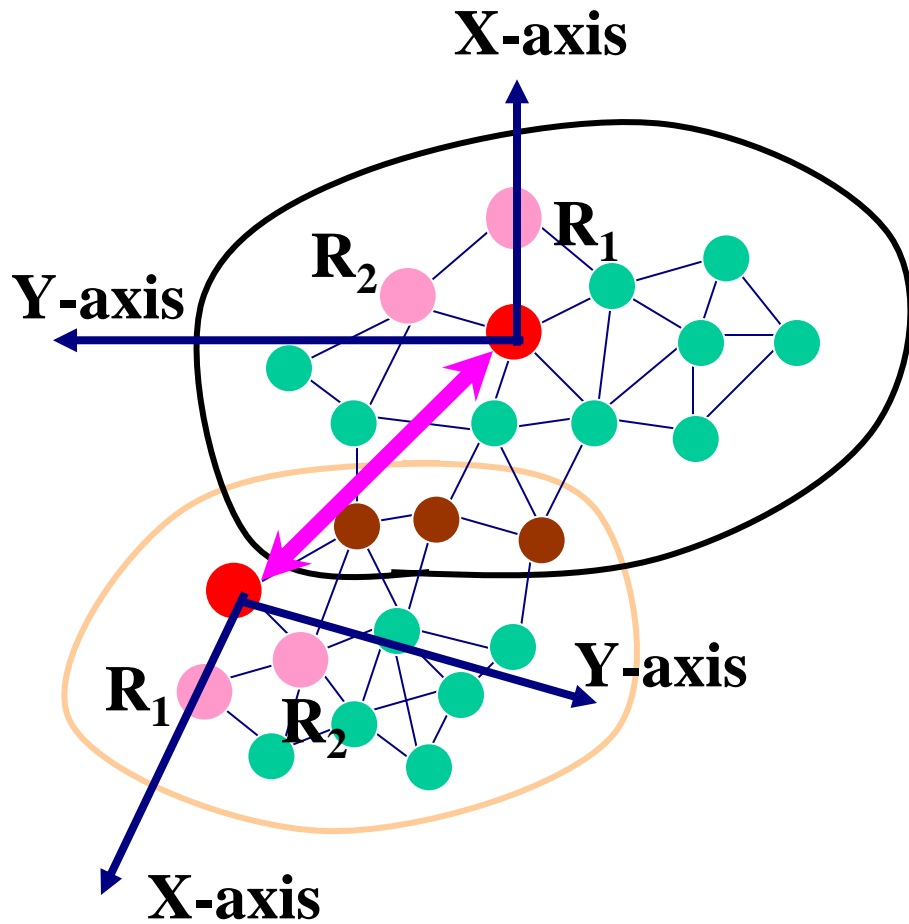
## Phase II: Local Location Discovery

- Each gateway node has inter-node distance matrix  $D$  for the nodes that are within  $K$ -hops.
- Build a local map for the cluster.



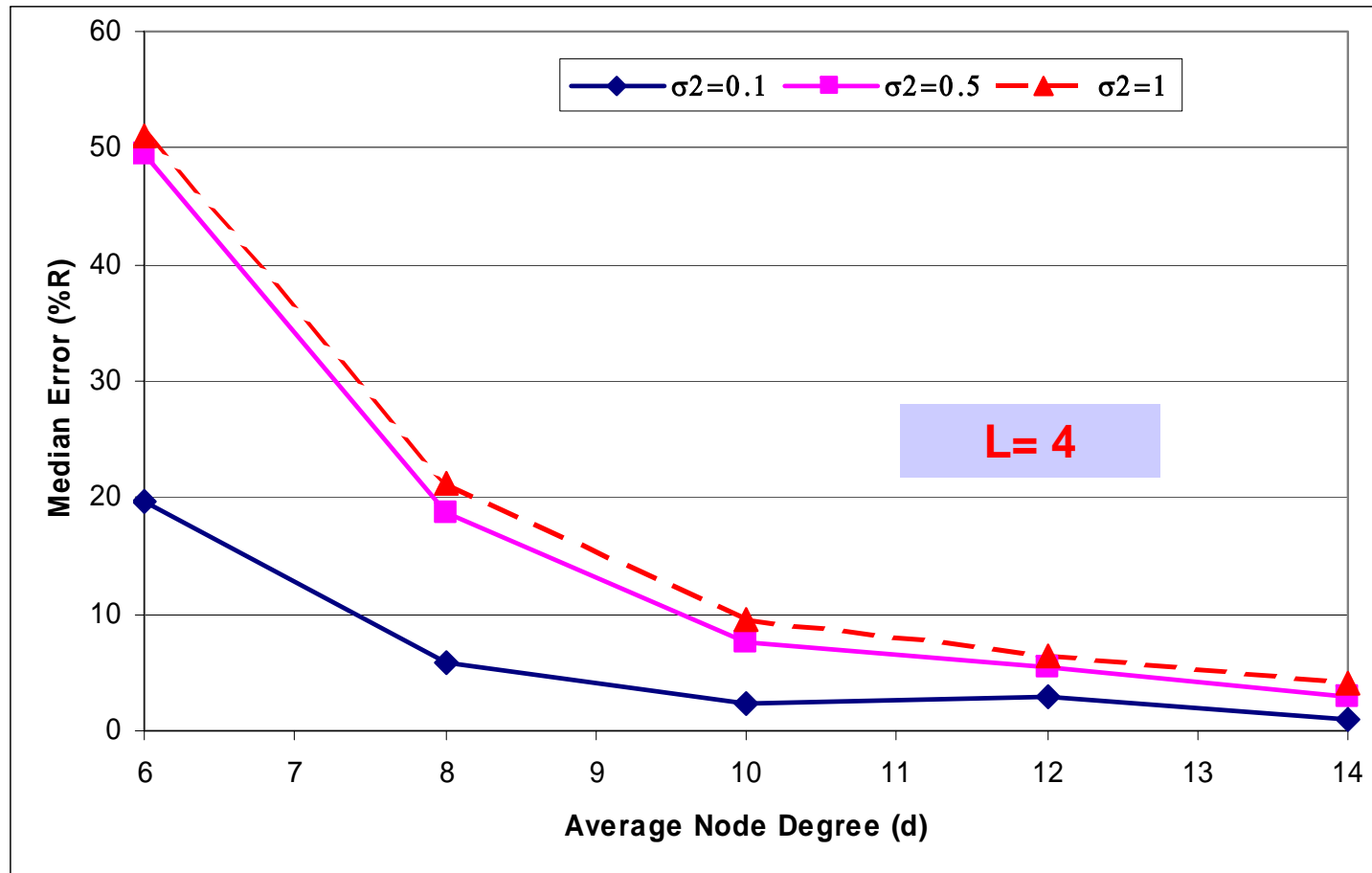
# SALAM

## Phase III: Integrated View

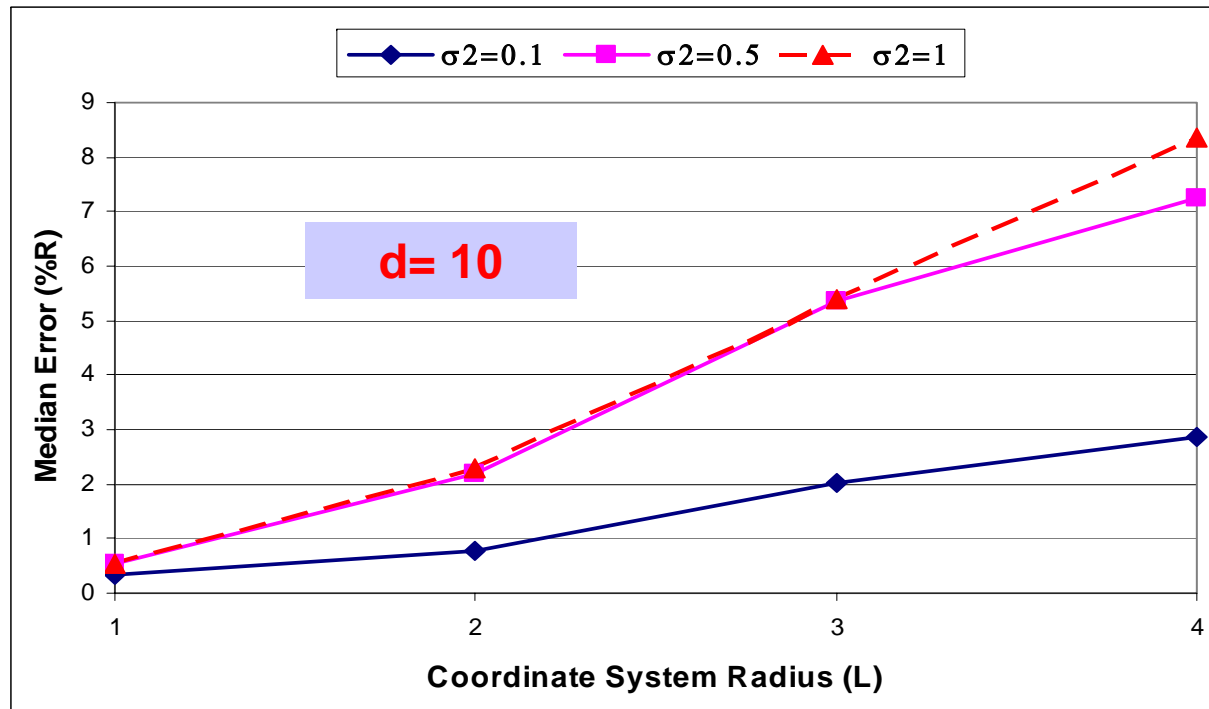


## Experimental Setup

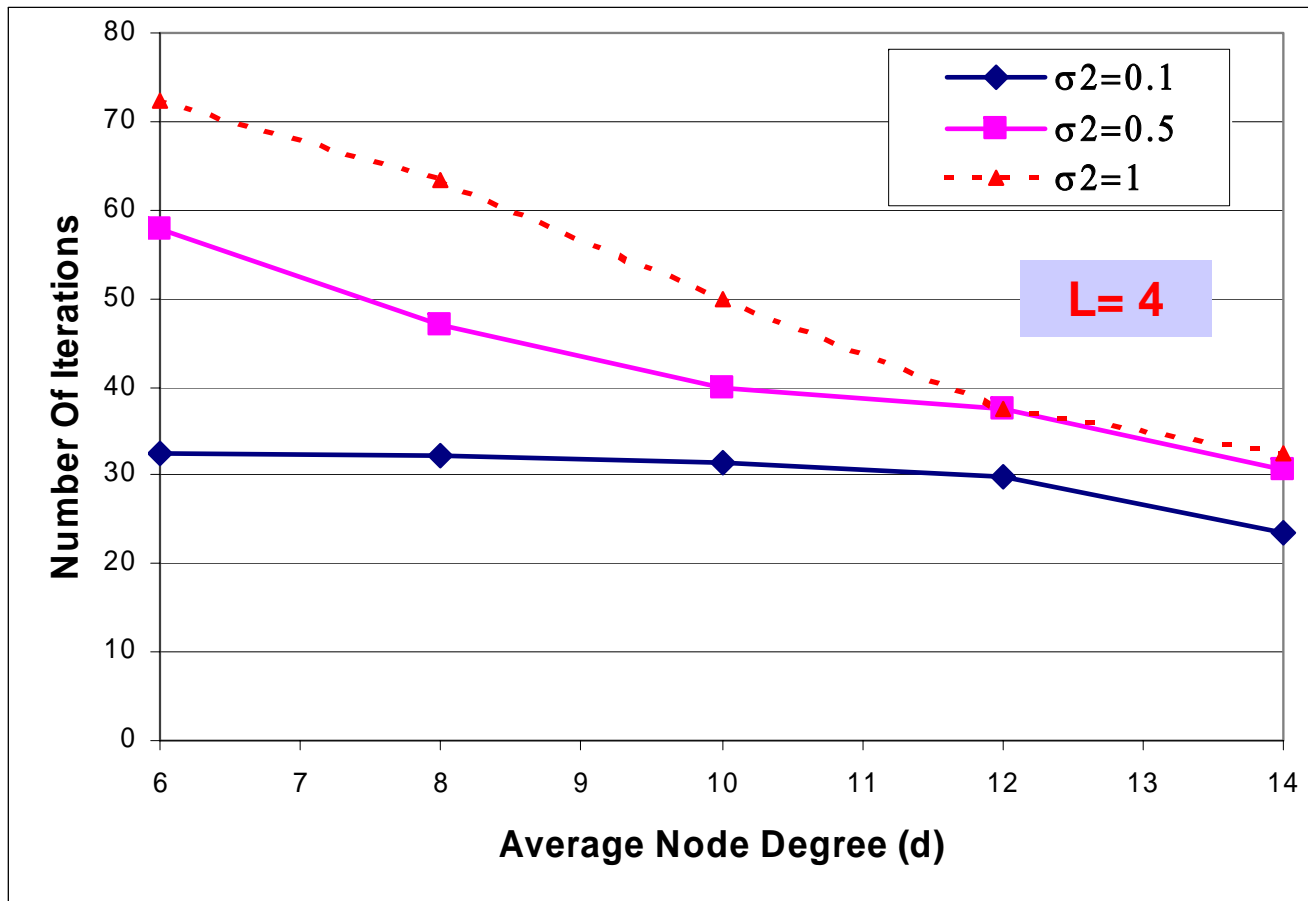
- 1000 different topologies, different cluster size ranging from 20-60 nodes per cluster
- Nodes are randomly placed according to a uniform distribution on a 100x100 area
- Varying transmission range to achieve different node degree (6-14)
- Different coordinate system radius (1-4)
- Range Error:  $N(0, \sigma^2)$ , where  $\sigma^2$  ranges from 0.1-1



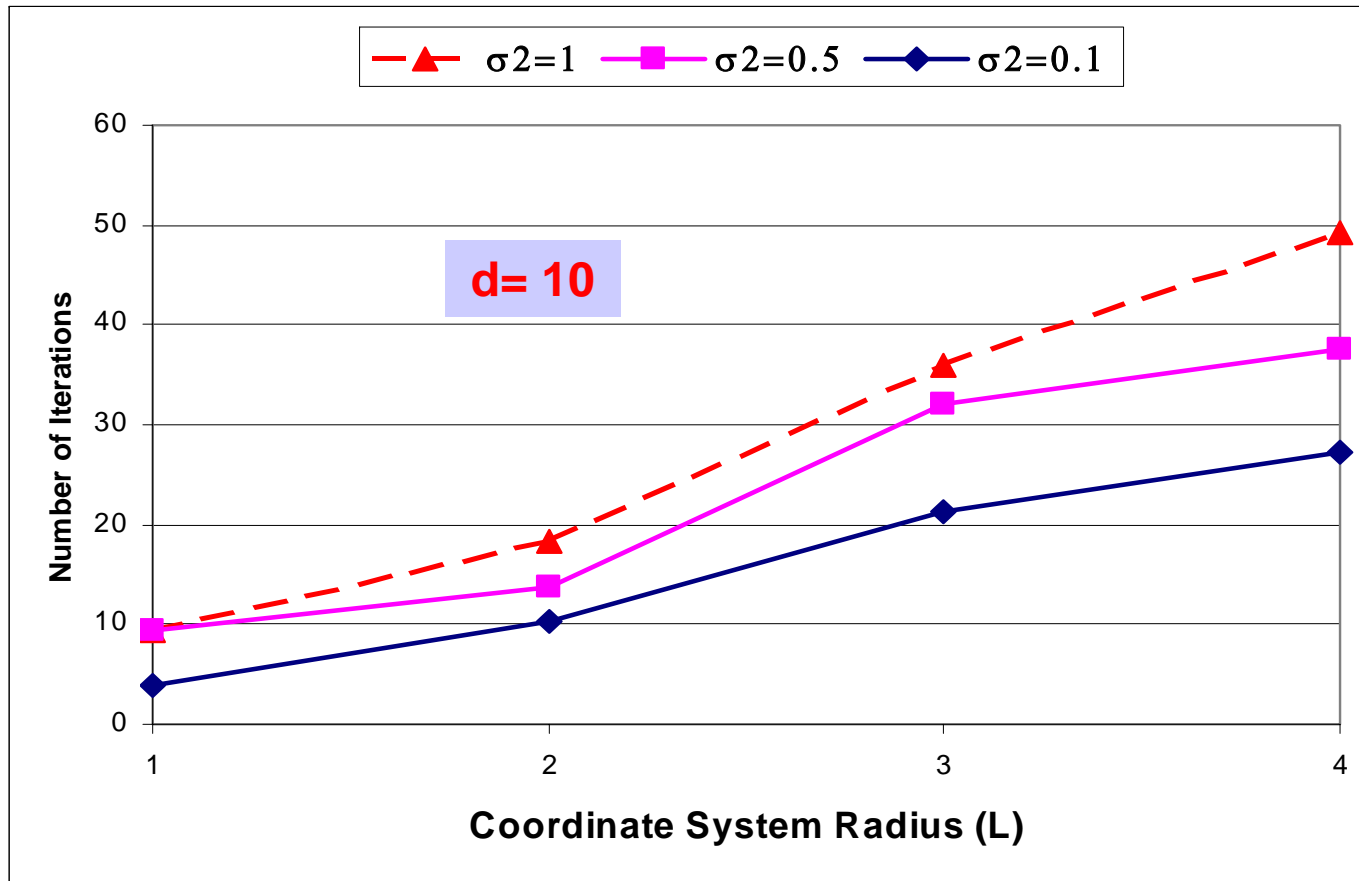
As node degree increases, range errors become very insignificant.



- Decrease in accuracy is *linear* in “L”.
- A jump in the range error variance from .5 to 1 caused little impact compared to the increase for .1 to .5. Such observation stresses the importance of employing a good range measurements technology.



## The Effect of Coordinate System Radius on Convergence Latency



# Conclusion

- Developing a cluster-based anchor-free localization algorithm for as hoc sensor networks:
  - Network bootstrapping (the OK clustering algorithm)
  - Local location discovery (formulating a LSE model to minimize the intra-cluster cumulative errors)
  - Global location discovery (finding the best order of transformations)
- Analyzing the effect of different parameters on the performance of the system.
- Analyzing error accumulation (inter-/intra-cluster).
- Compare the performance of the proposed system with other anchor-free systems.



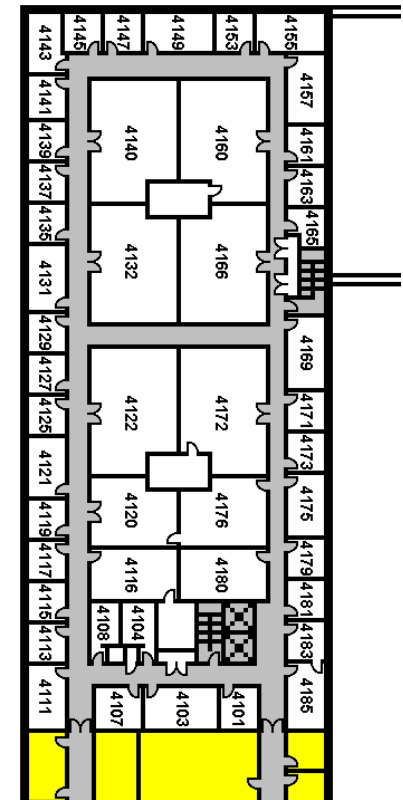
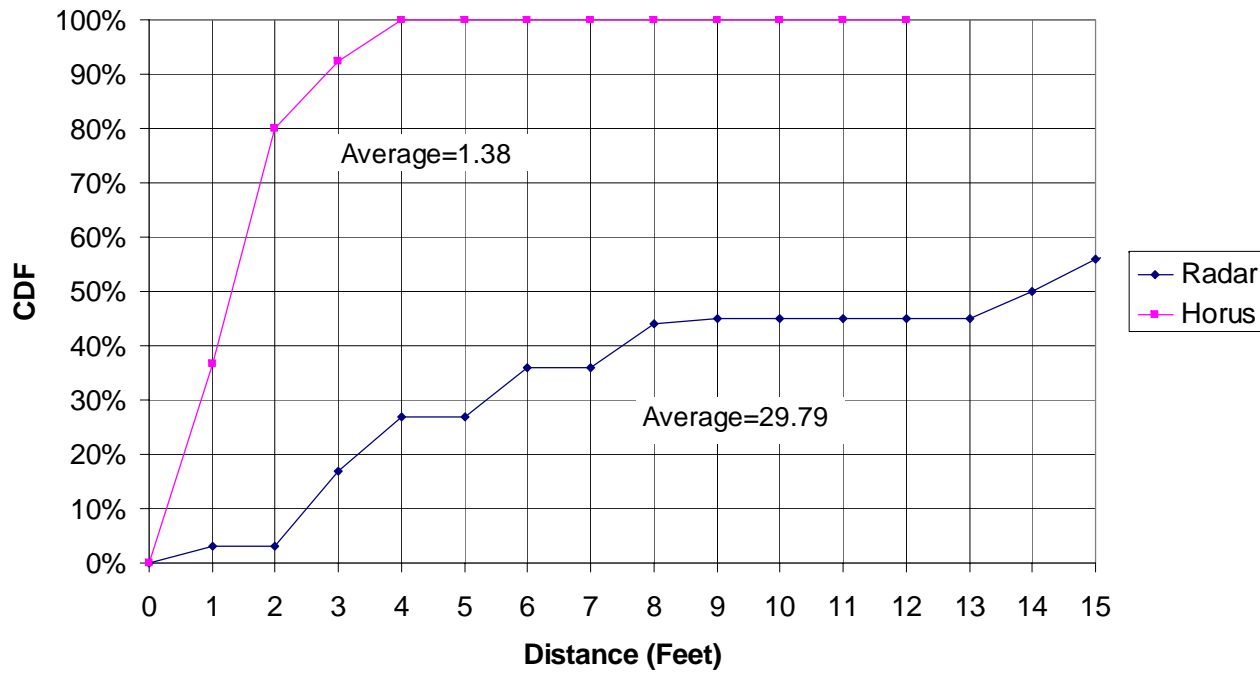
# Location Determination

## Horus Technology

- Signal-Strength (RSSI) Based Approach
- A few commercially available, e.g. Ekahau, PanGo
- A few research groups working on it
- Horus results significantly better than all
- Licensed by Fujitsu and deployed in a shopping center application

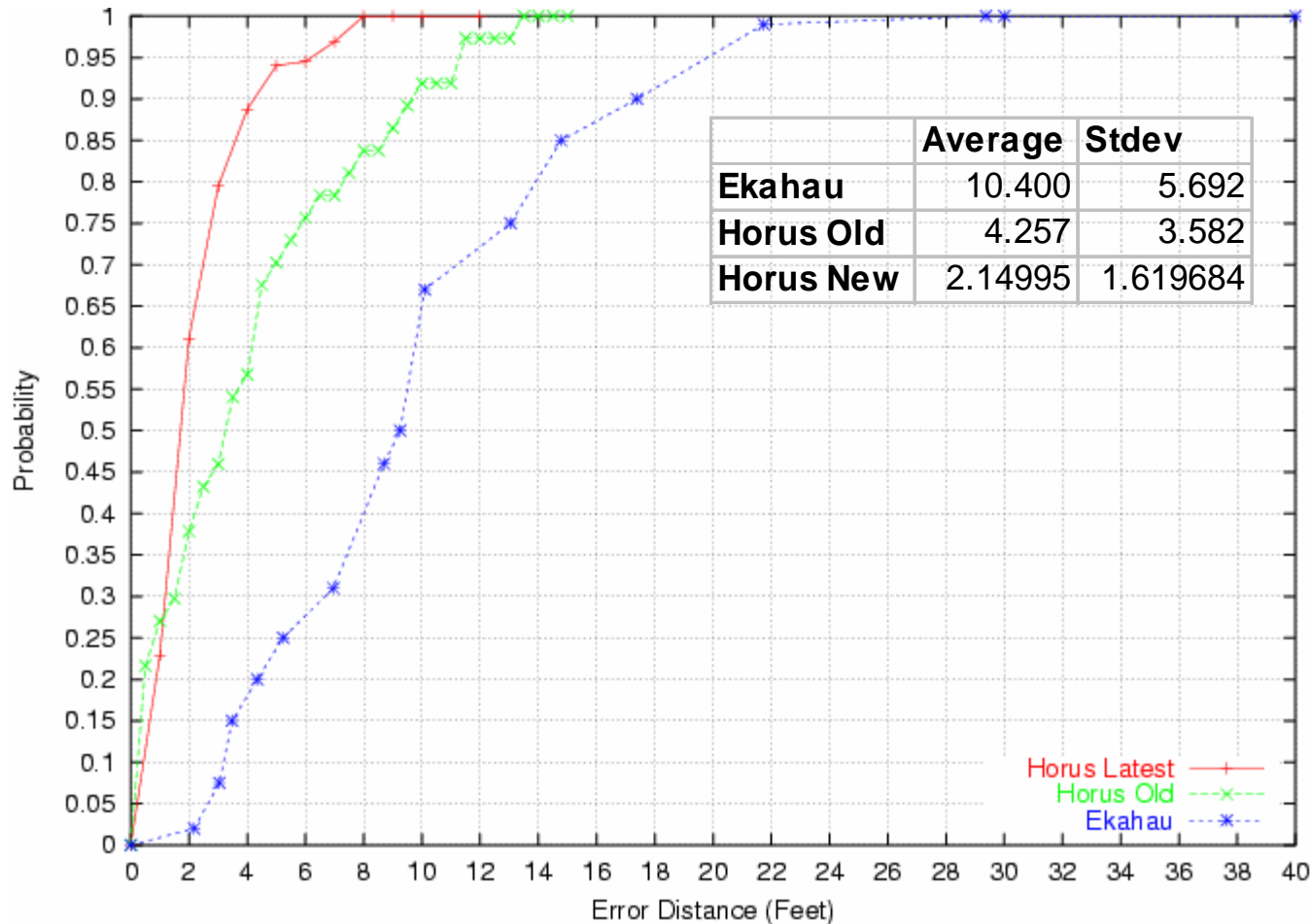


## Comparison With Other Systems: RADAR



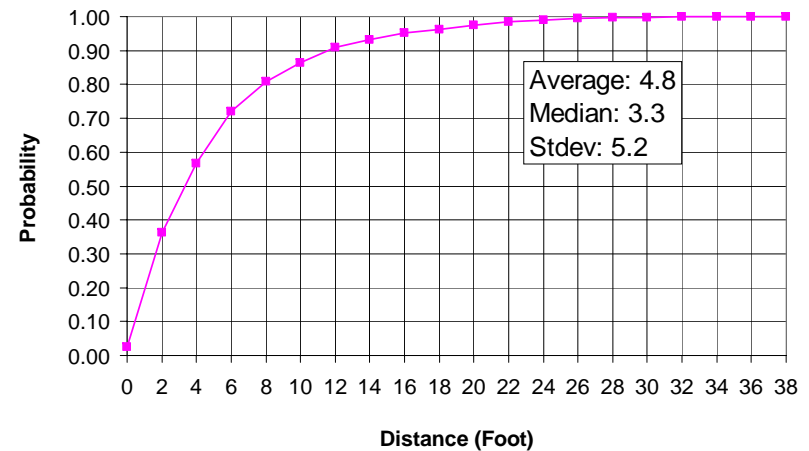
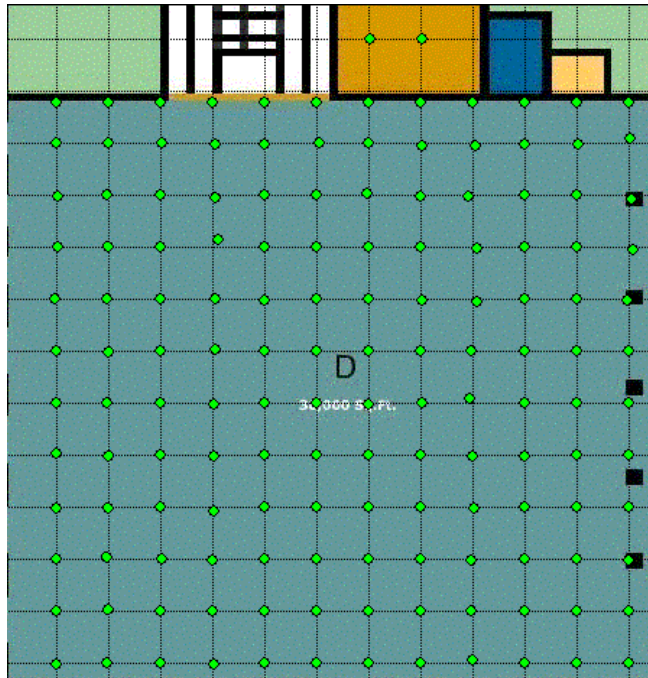
# Horus

## Comparison With Other Systems: Ekahau



## Baltimore Convention Center Test

- Large Open Hall 150' by 150'



## Recent Enhancements

- Speed and Direction Estimation
- Latency Reduction
- Barrier Detection
  
- “Click and Connect”
  
  
- DEMO!!

# Passive Determination of Location Nuzzer Technology

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## Passive Object Recognition Problem

- Can the location of a person/object be determined without the person carrying an active device, e.g. a NIC or an RFID ?
- Are the changes in RSSI sufficient for this purpose ??
- Nuzzer Technology



## Initial Experiments

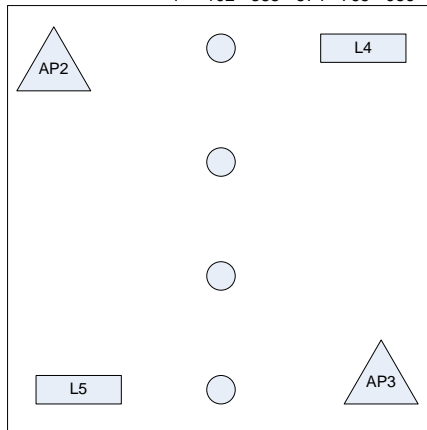
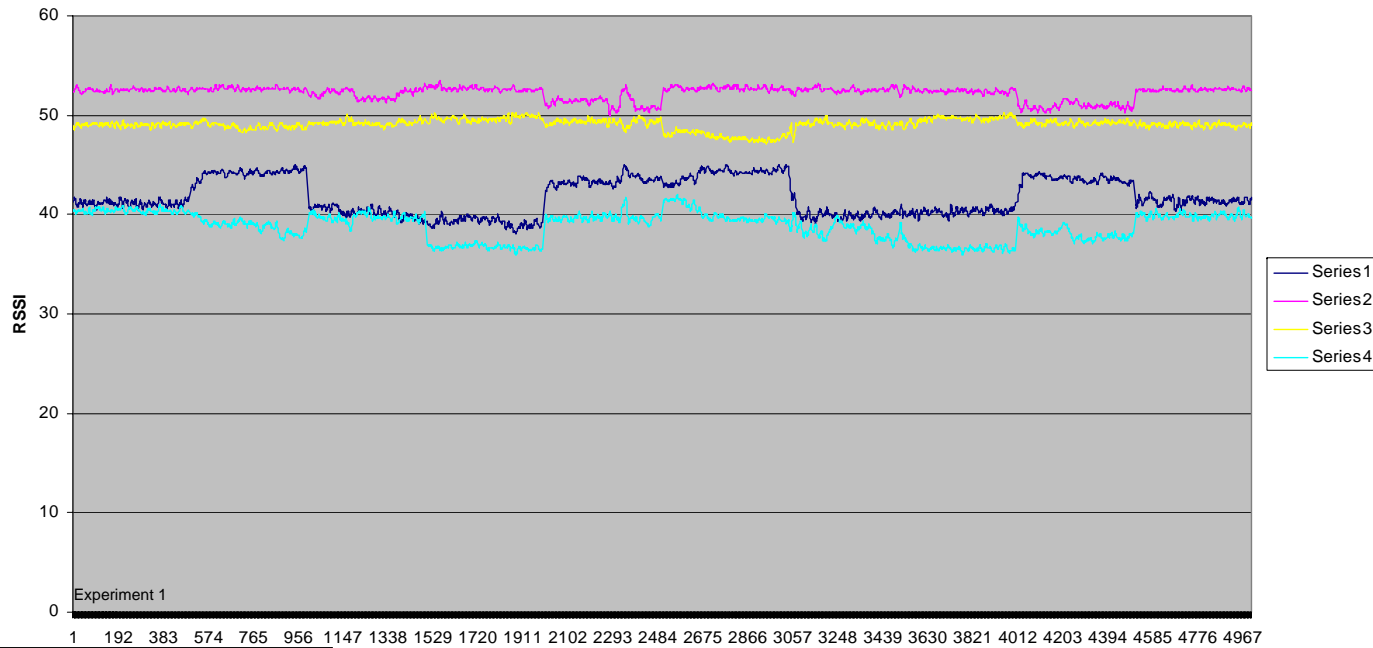
- Conducted controlled experiments in a bank vault
  - “no” outside RF interference
- Placed two APs and two laptops with NICs at selected locations
- Initially nobody in the room
- Then a person stands at 4 locations which are 3 feet apart.





## Experimental Setup and Results

Experiment 1 MV Data



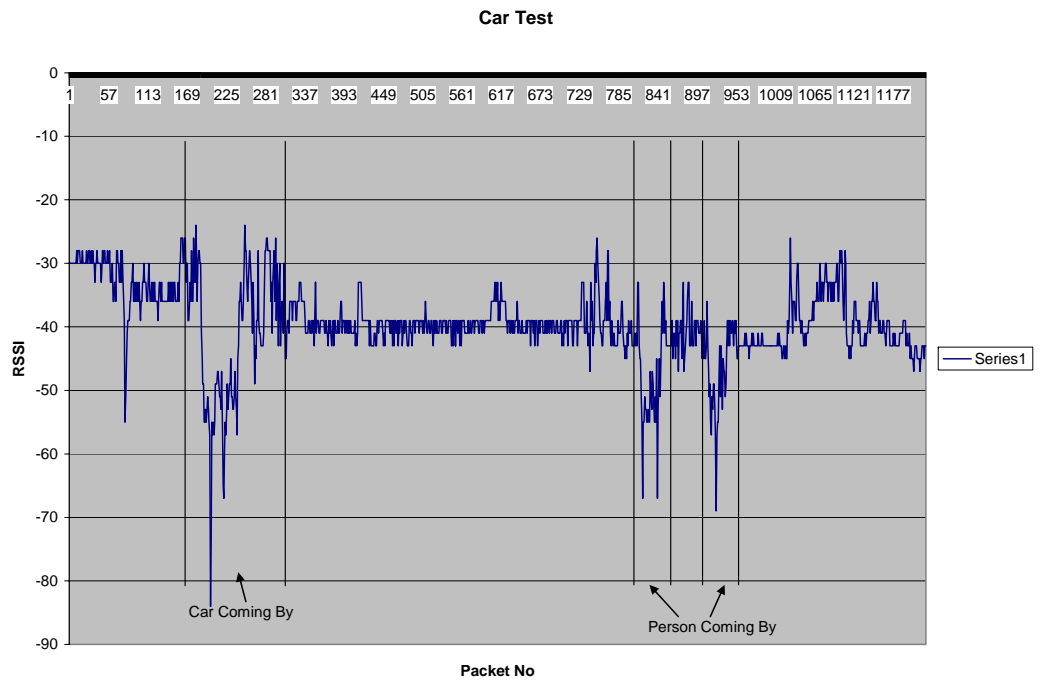
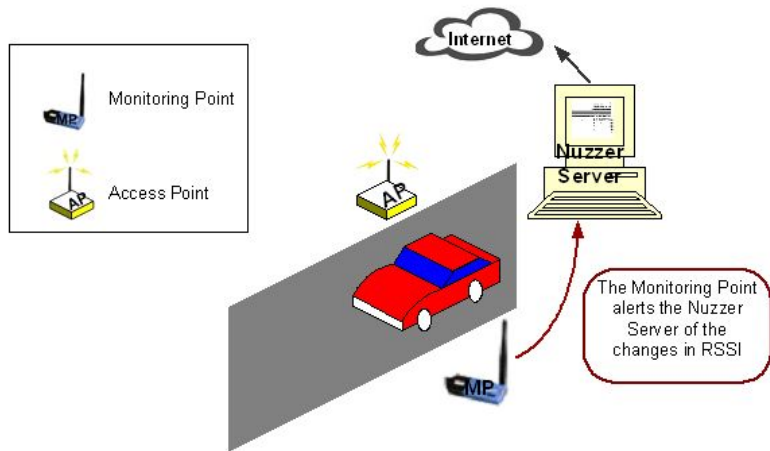
Seq No	Training set = SET1	Training set = SET2
total	4920	4920
correct	4410	4243
err	510	677
%err	10.36585	13.76016



## Nuzzer Indoors

- Initial results
  - $> 85\%$  accuracy
  - Can improve by using better techniques
- Performance limited by the accuracy/repeatability of RSSI measurements
- Can we use this approach outdoors to detect objects
  - Vehicles in a protected zone – Railroad track, Pipeline,...

## Nuzzer Outdoors



## Characteristics of RF Fields

- Need to understand the characteristics of RF fields
  - Multipath effects
    - Reflection
    - Refraction
    - Scattering
    - Diffusion
  - How are they affected by the presence of objects
    - Humans
    - Metal Objects
- Need a good model



## Radio Wave Propagation

- Signal Intensity

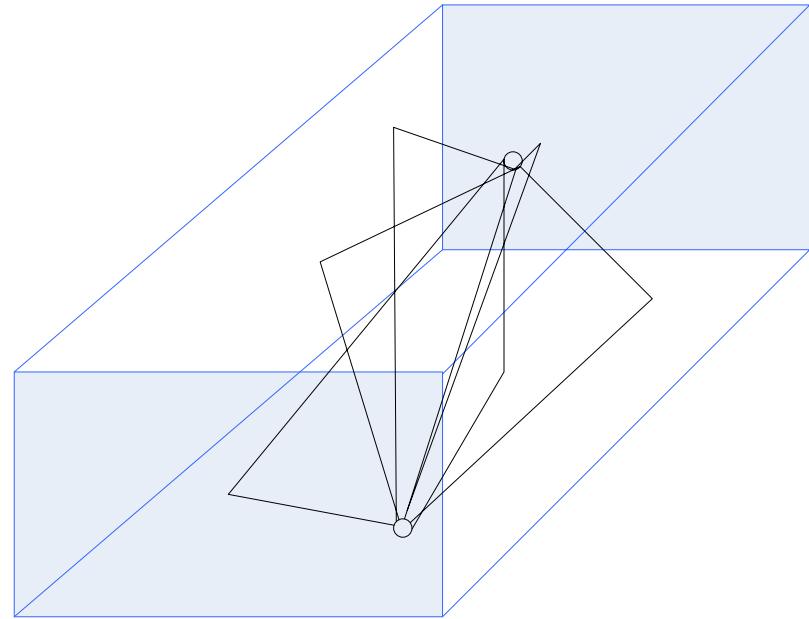
$$J(x) = (J_0 x^{-D}) e^{i(2\pi fxc)}$$

- $x$  = distance from source
- $J_0$  = signal amplitude at source
- $f$  = frequency (2.4 GHz)
- $D$  = Exponent value contributing to decay of signal as a function of distance  $x$
- $c$  = speed of light in free space



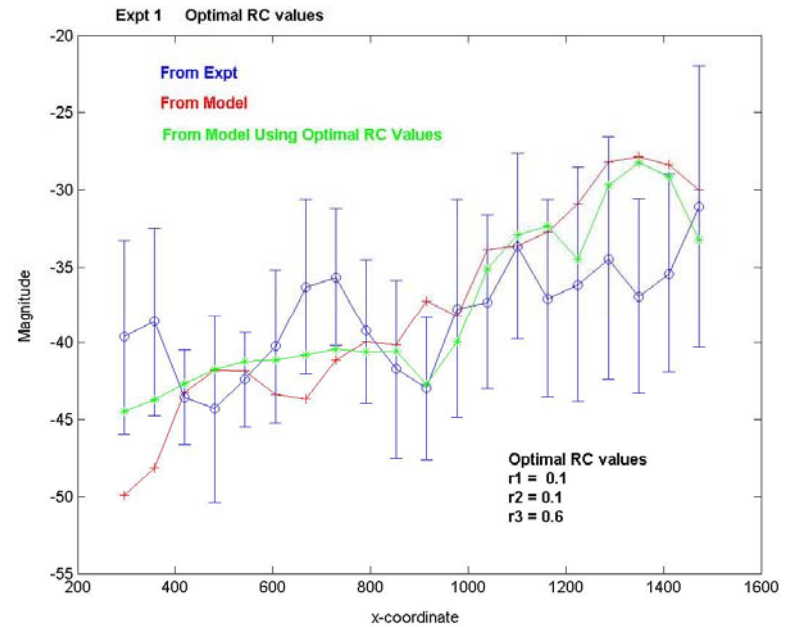
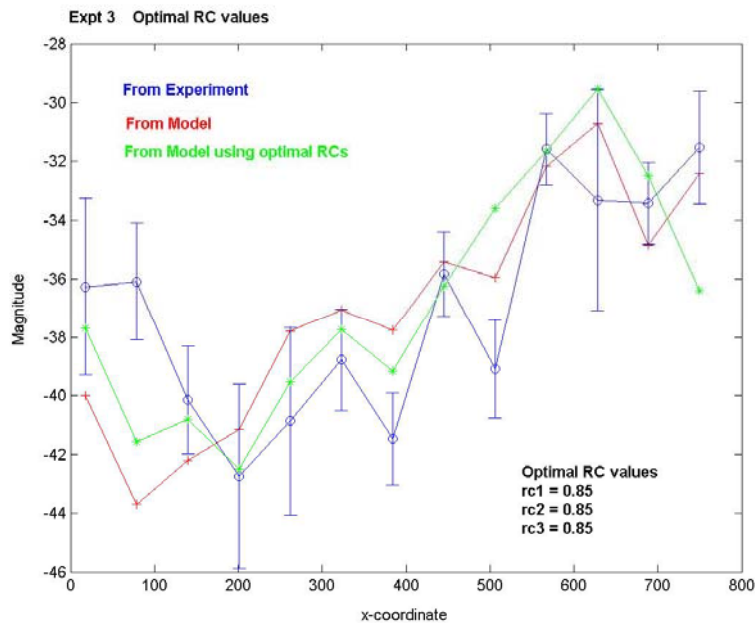
## Wave Propagation Model

- Consider a 3D rectangular box
- One transmitter
- One receiver
- Take into account
  - Direct line of Sight
  - Six reflected Waves
- Validate the model with empirical measurements

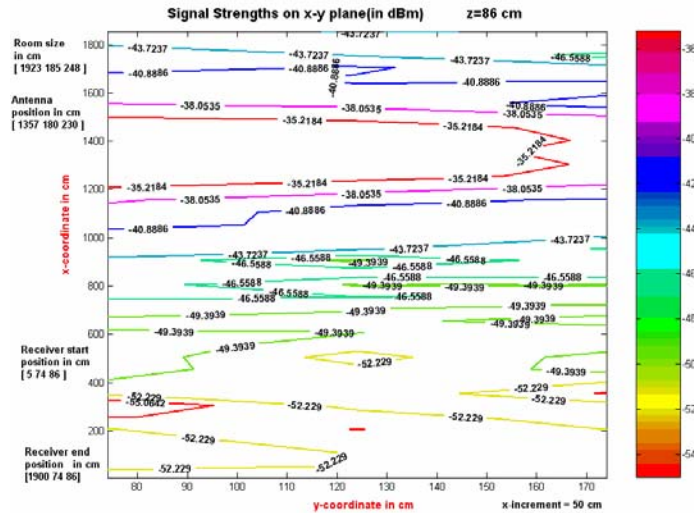
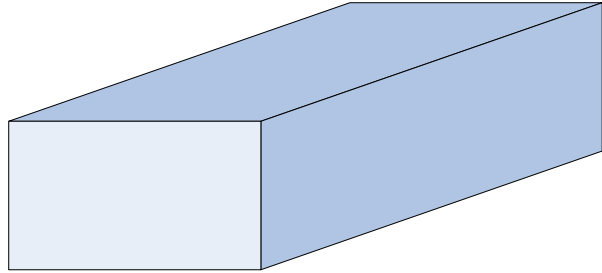


## Model Validation

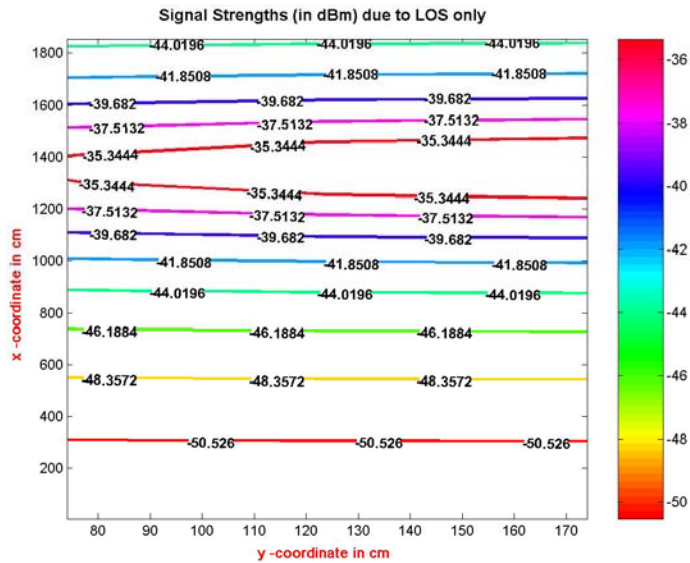
- Measurements along one corridor
- Optimal Model values mostly within one sigma of the measured values



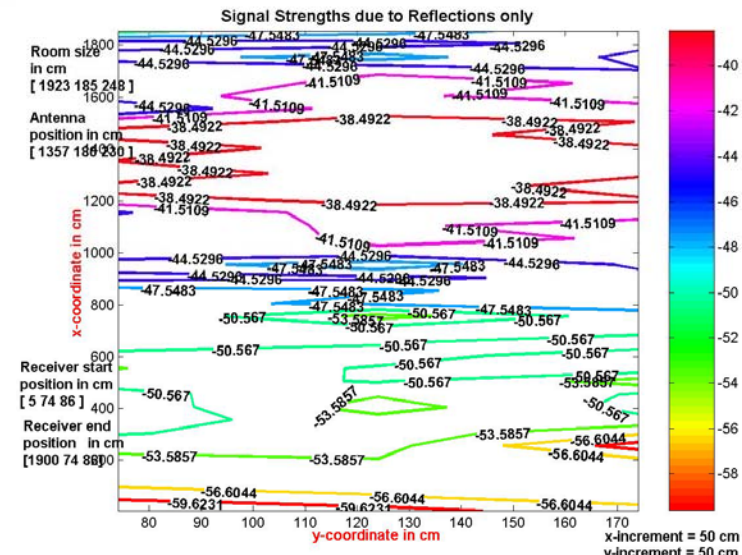
## 2D Signal Plots – Corridor – XY Plane



Combined



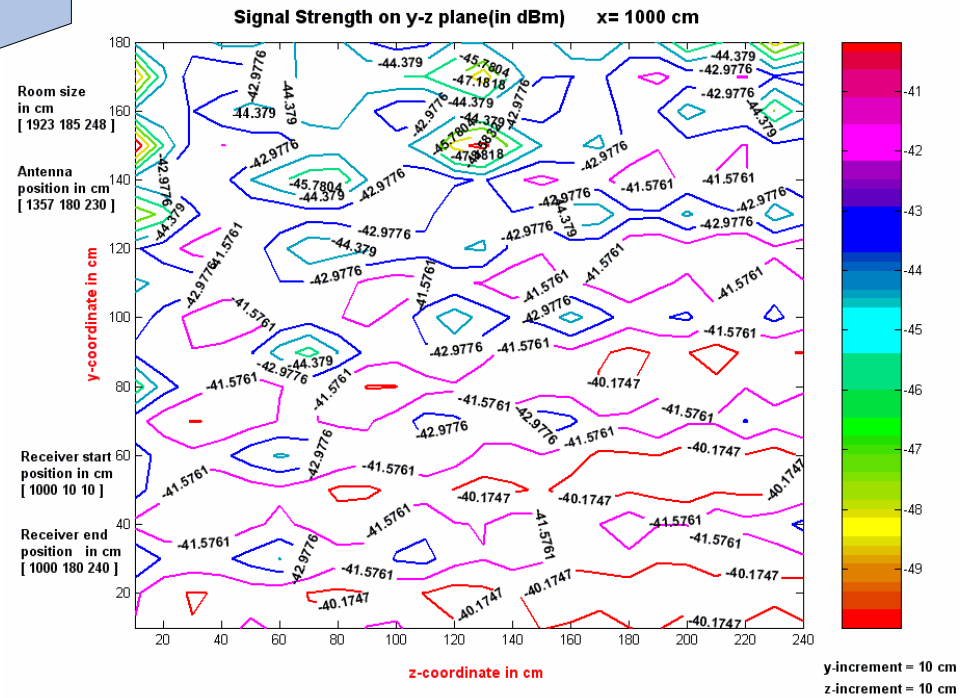
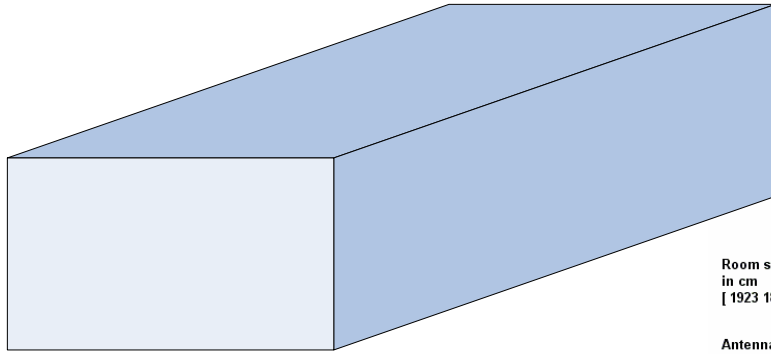
LOS Only



Reflections Only



## 2D Signal plots – YZ Plane



## Effect of an Object on RF Field

- Initial model of an object
  - Block
    - Rectangular
    - Spherical
  - Empirical
    - Measurements with a person at a known location
    - Conducted measurements in the corridor

Estimated		Measured
-45.3929		-44.7
-42.2258	Front	-41.2
-38.7981	left	-36.7
-41.9157	behind	-40.8
-45.3929	right	-44.6

## Model of Signal Strength

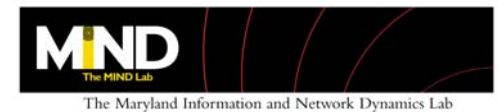
- Account for variabilities
  - Temporal
    - Due to noise in receive circuits
    - Movement of objects
  - Spatial
    - Variability due to multipath affects
- Use the results to improve Horus and Nuzzer
- Placement of Transmitters and Receivers
  - Avoid “holes”
  - Assess effectiveness of the locations

## Applications

- Home
  - Security
    - Location of intruder
    - Internet intimation
- Office
  - Monitoring in the night at no additional costs
- Outdoors
  - Pipelines
  - Railroad tracks
  - Parking lots
  - ...



# Energy Efficient Routing

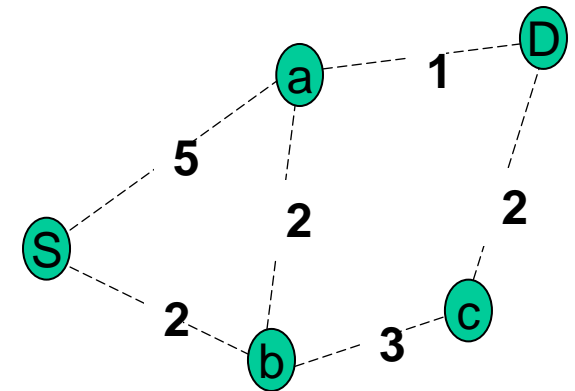


The Maryland Information and Network Dynamics Lab

# Introduction

- Motivation
  - Energy is a scarce resource
  - Transmissions consumes large portion of node energy
  - Noise  $\rightarrow$  Error Rate  $\rightarrow$  Retransmission  $\rightarrow$  Energy Consumption

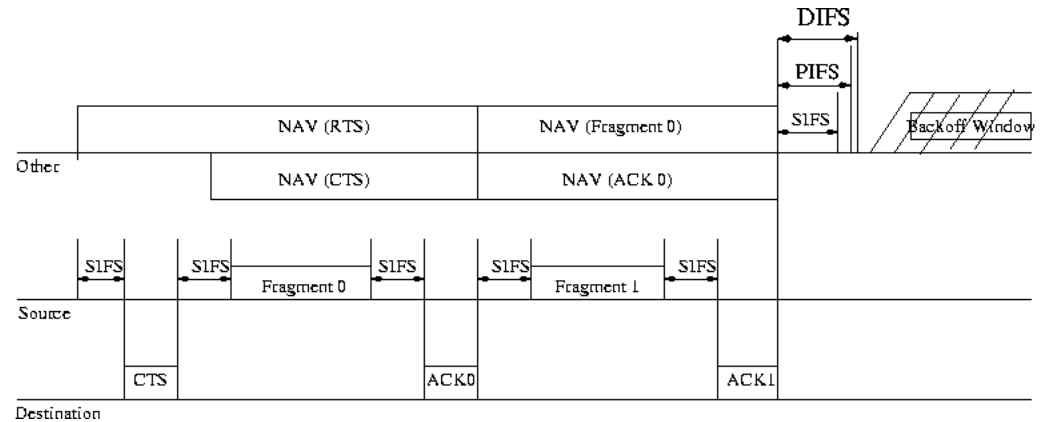
- To reduce energy consumption, we need reduce the number of retransmissions.
- In ad hoc networks, paths with low number of retransmissions along the hops minimize the end-to-end energy consumption.



- Develop mechanism for AODV protocol using IEEE 802.11 as MAC layer to construct energy-efficient paths.

# IEEE 802.11 Fragmentation

- Fragmentation mechanism:
  - A Frame will be fragmented to frames with length no longer than *aFragmentThreshold*.
  - Each fragmented frame is sent as independent transmission.
  - Each is separately acknowledged.
  - Retransmissions occur per fragment.



- Fragmentation bits overhead:
  - $o_1$  bits: transmitted separately with each fragment and are not considered as a part of the fragment bits (e.g. PLCP preamble bits, PLCP header, ACK frame).
  - $o_2$  bits: transmitted within each fragment (e.g., frame header, frame CRC).

# Link Cost with 802.11 Fragmentation

- Cost of transmitting  $L$  bits using fragments of  $k$  bits:

$$C = v \times (o_1 + k) \times \frac{L}{k - o_2} \times \frac{1}{(1 - p)^k}$$

$v$ : transmission energy per bit

$p$ : bit error rate over the link

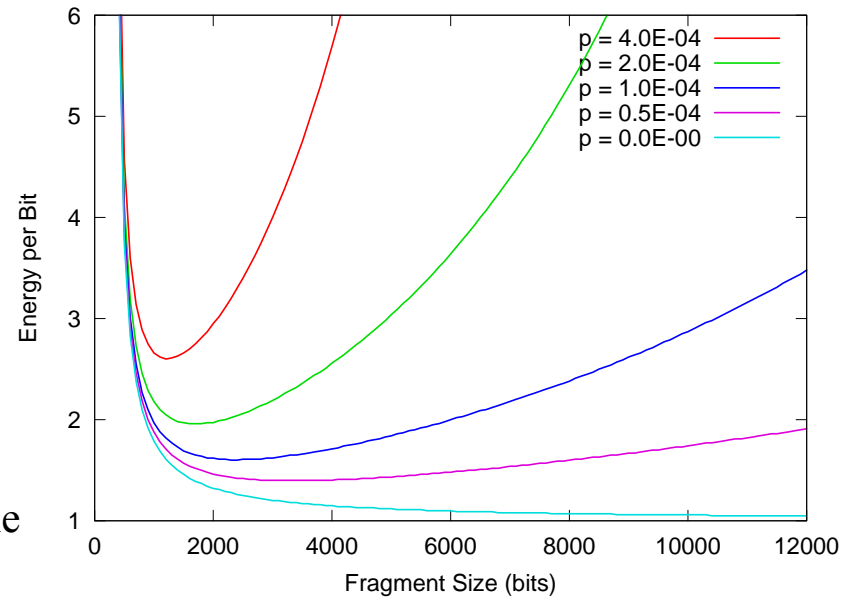
$o_1$ : bits: transmitted separately with each fragment and are not considered as a part of the fragment bits (e.g. PLCP preamble bits, PLCP header, ACK frame).

$o_2$ : transmitted within each fragment (e.g., frame header, frame CRC).

- Optimum fragment size is:

$$k^* = \frac{(o_2 - o_1)\beta - \sqrt{(o_2 - o_1)^2\beta^2 - 4\beta(o_1 + o_2 - o_1o_2\beta)}}{2\beta}$$

where  $\beta$  is  $\ln(1 - p)$



Energy consumption for each transmitted bit where  $o_1=250$ bits,  $o_2=300$ bits, and  $v=1$ unit





# Bit Error Rate Estimation in AODV

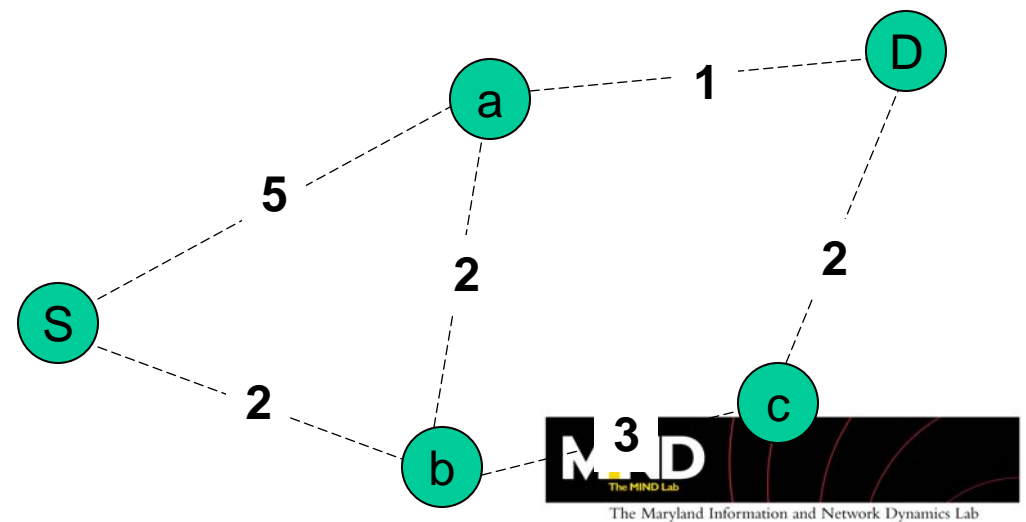
- Link cost is calculated at the receiver side only
  - Link bit error rate needs to be estimated at the receiver side only.
- Estimation mechanisms:
  - Probe Packets
    - Each node broadcasts a probe packet periodically.
    - Each probe has a sequence number.
    - Receiver can track the number of dropped packets
      - estimate the bit error rate
  - Signal-to-Noise Ratio ( $SNR = 10 \cdot \log(P_r/N)$ )
    - Bit error modeled as function of SNR of the link

$$p \propto \operatorname{erfc}(\sqrt{\text{constant} \times SNR})$$

- Each node is capable of measuring the SNR for each received packet.
- AODV uses periodic *Hello* packets each  $t$  sec jittered by up to  $\pm 0.25t$ .

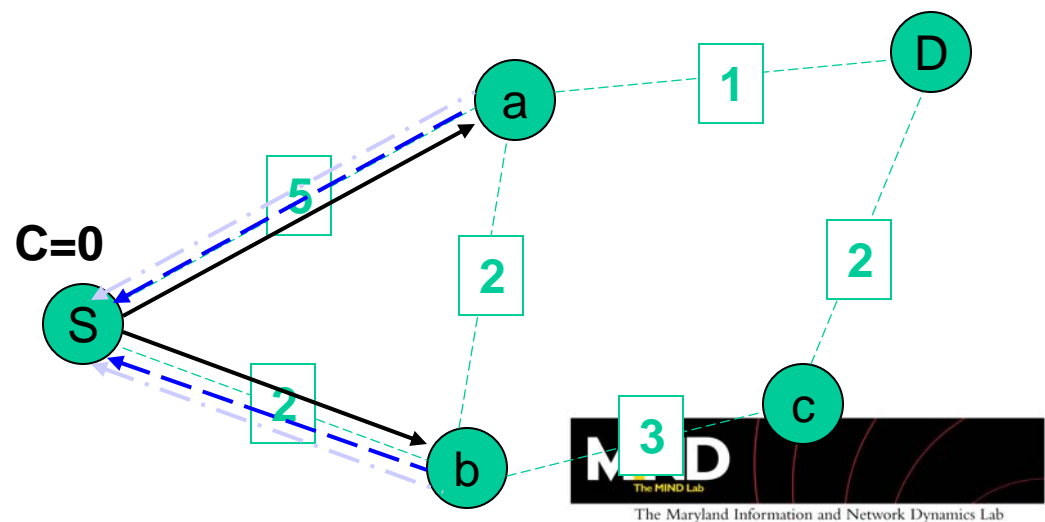
# AODV in Noisy Environments

- Construct forward path from S to D



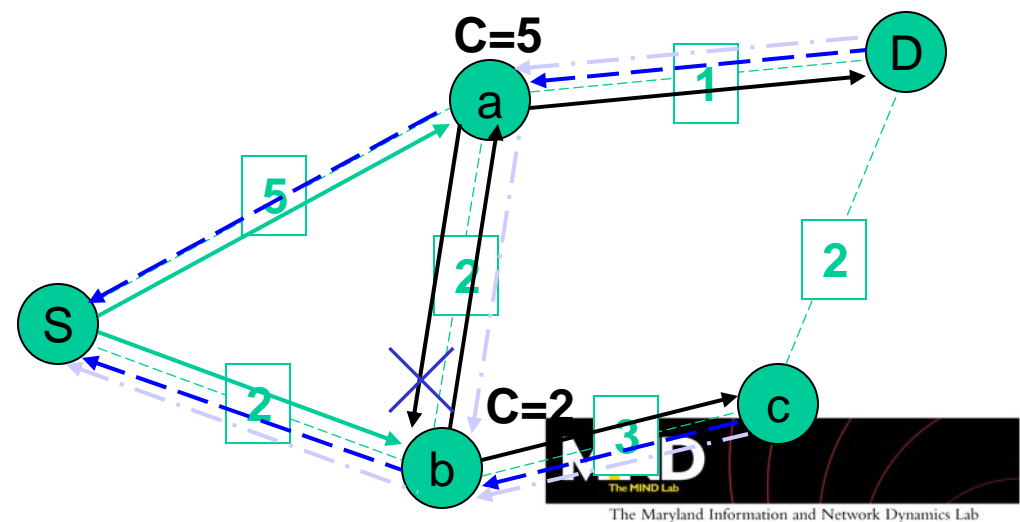
# AODV in Noisy Environments

- Construct forward path from S to D
  - S broadcasts RREQ augmented with a cost field, C, initialized to Zero
  - Each node receives RREQ
    - Updates the cost filed by the link cost
    - Stores the backward path to S



# AODV in Noisy Environments

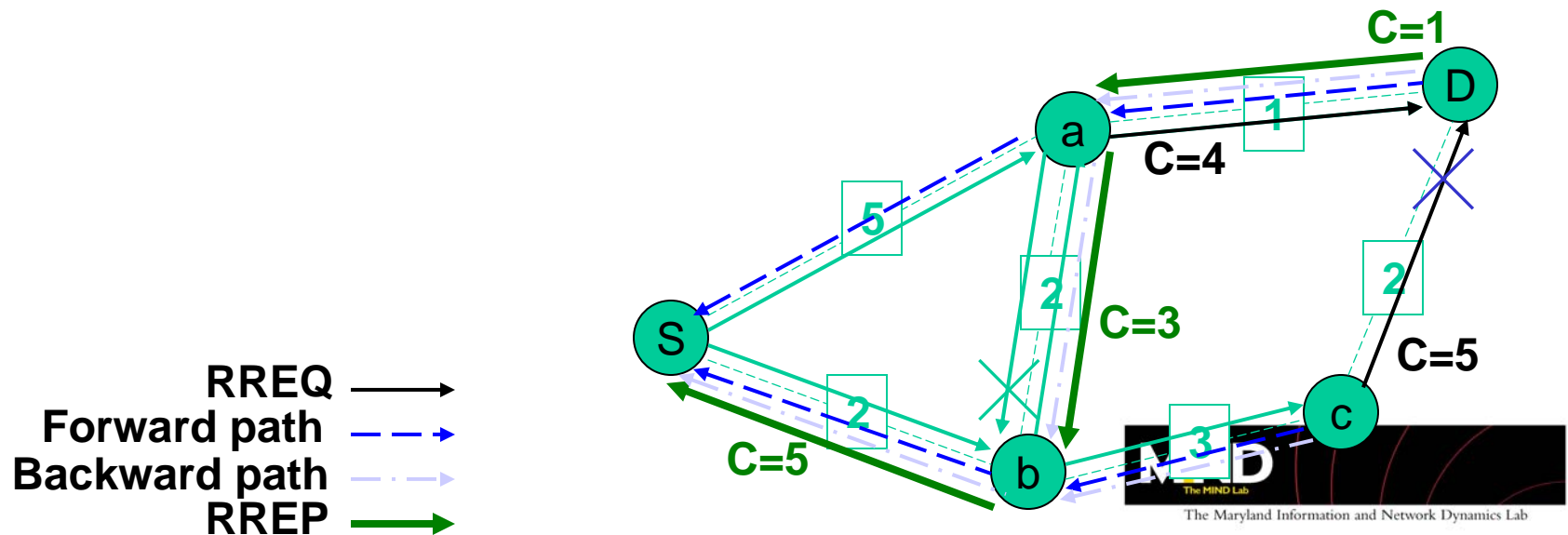
- Construct forward path from S to D
  - S broadcasts RREQ augmented with a cost field, C, initialized to Zero
  - Each node receives RREQ
    - Updates the cost filed by the link cost
    - Stores the backward path to S
  - Each node accepts RREQ with lower cost and rebroadcasts it



RREQ →  
Forward path →  
Backward path →

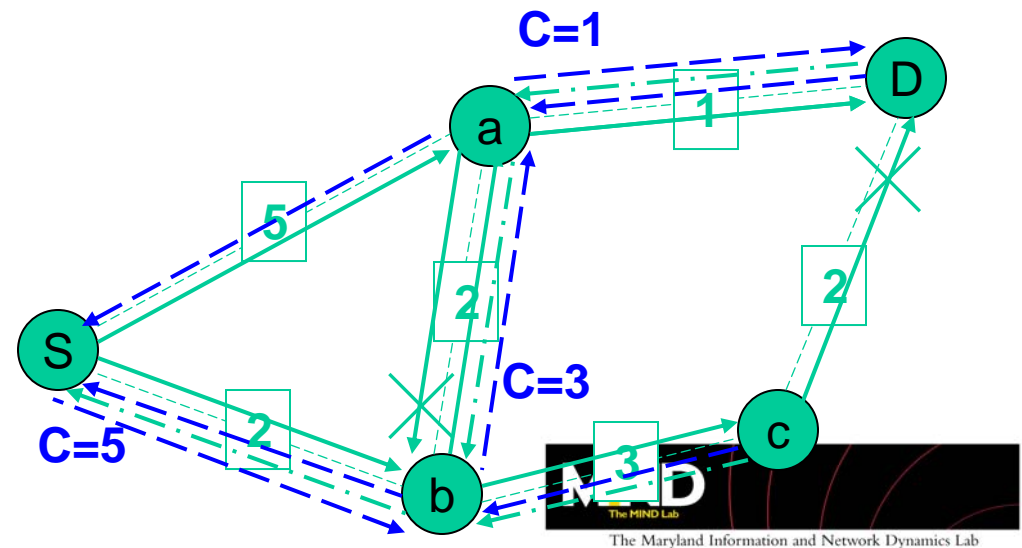
# AODV in Noisy Environments

- Construct forward path from S to D
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    - Stores the backward path to Each node accepts RREQ with lower cost and rebroadcasts it
  - RREP follow the backward path, contains
    - Partial cost to D
    - Optimum fragment over the transmitted link



# AODV in Noisy Environments

- Construct forward path from S to D
  - S broadcasts RREQ augmented with a cost field, C, initialized to Zero
  - Each node receives RREQ
    - Updates the cost filed by the link cost
    - Stores the backward path to Each node accepts RREQ with lower cost and rebroadcasts it
  - RREP follow the backward path, contains
    - Partial cost to D
    - Optimum fragment over the transmitted link



**RREQ** →  
**Forward path** →  
**Backward path** →  
**RREP** →

# Performance Evaluation

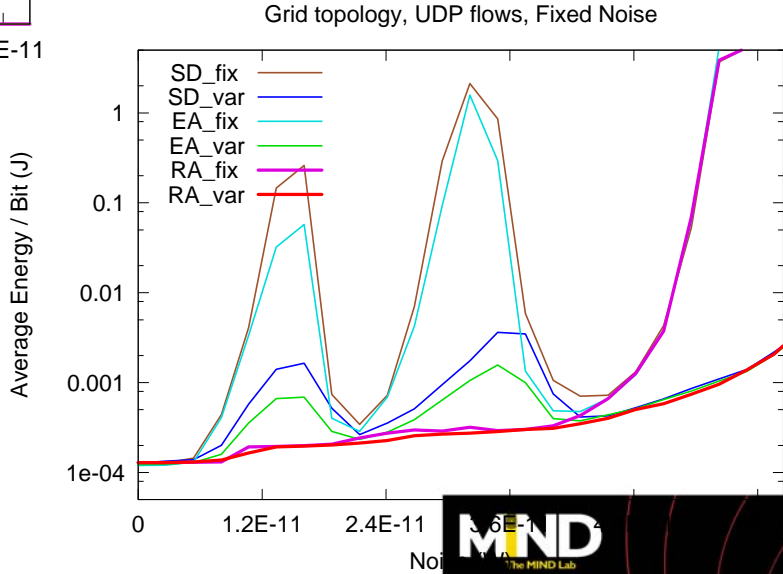
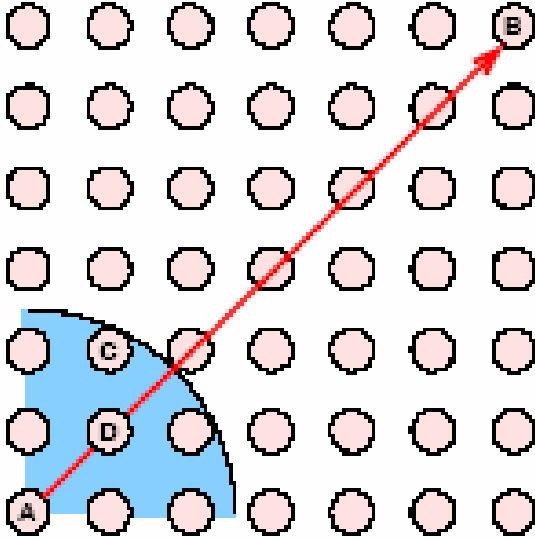
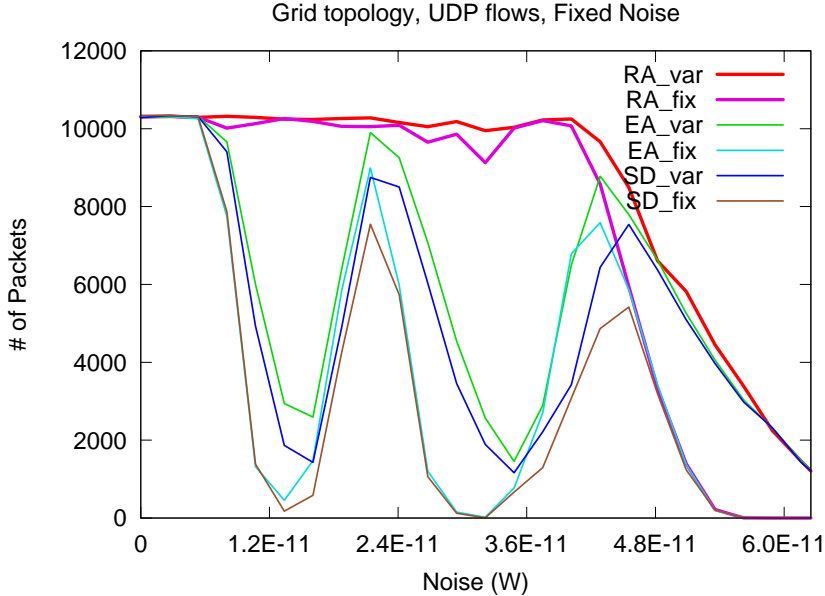
- NS-2, simulation parameters
  - 49 nodes
  - Area of 700mX700m
  - 12 UDP flows, 1500 bytes each 0.2 sec
- Routing schemes
  - AODV Standard (SD\_fix, SD\_var)
  - Energy-Aware (EA\_fix, EA\_var)
  - Retransmission-Aware (RA\_fix, RA\_var)
- 250 seconds simulation 50 seconds warm up
- Flows start in serial with gap of 5 seconds.
- Each point in the results is the average of 10 runs.
- Cost of single bit transmission over a link is  $60\mu\text{J}$ .

# Performance Evaluation

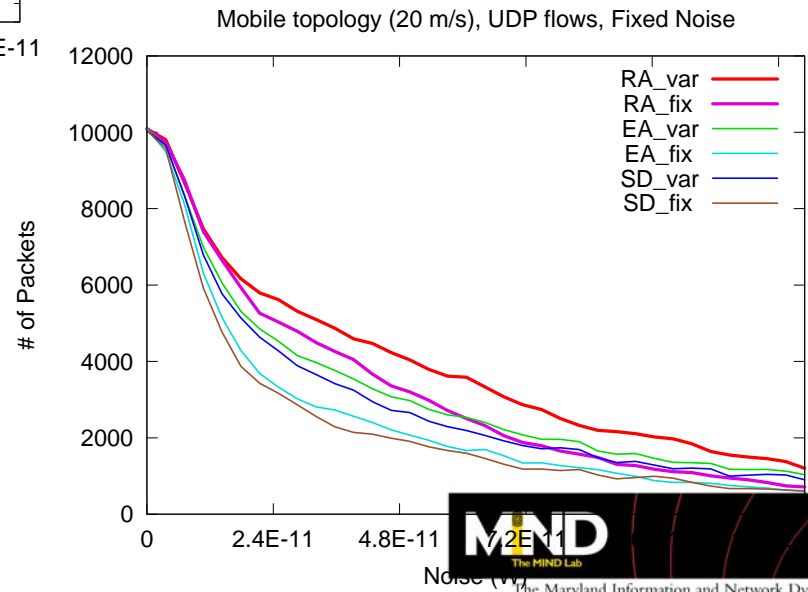
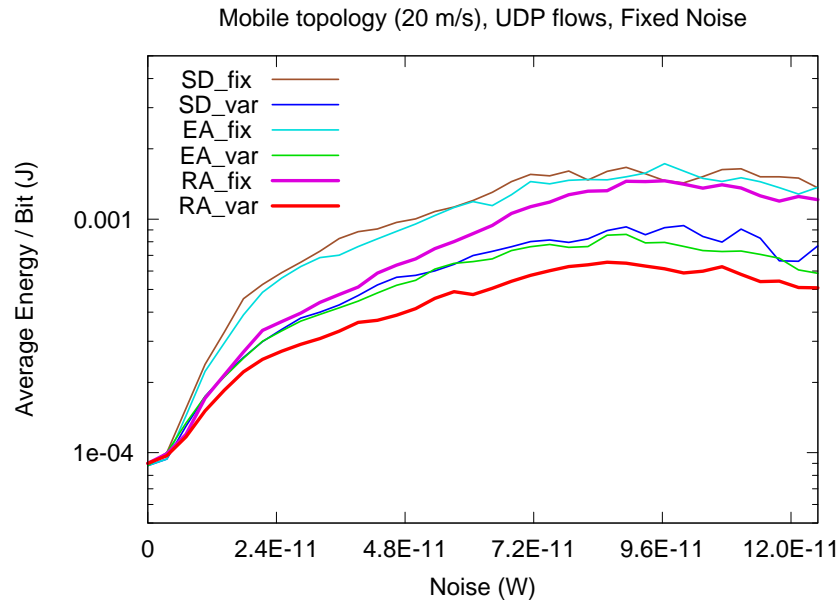
- Noise Models
  - Region partitioned into small square grids (50 x 50 each).
  - Grid's noise is Gaussian noise with  $\mu$  and  $\sigma$
  - $\mu$  is chosen to vary between  $Nmin$  and  $Nmax$ 
    - Fixed noise environment:  $Nmin$  is equal to  $Nmax$  [0.0, 20.0x10<sup>-11</sup>] W.
    - Random noise Environment:  $Nmin=0.0W$   $Nmax$  between [0.0, 20.0x10<sup>-11</sup>] W.
  - $\sigma$  is chosen to be equal to  $(0.1 \times \mu)W$ .



# Grid Topologies



# Mobile Topologies

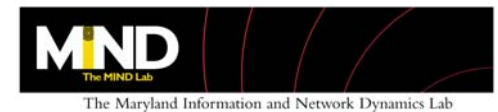


# Conclusion

- Our modifications and techniques can be ported and easily implemented on other routing protocols.
- Performance gains of our schemes will be magnified as the average path length becomes large, in large scale networks (hundreds or thousands of nodes).
- Other estimation mechanisms
- We assumed that the network noises characteristics are fixed during the network life time. Such assumption may not be true in some environments. Therefore, we need to develop mechanisms that discover and redirect the current flow to a new optimum path as soon as it changes.



# Enhancing 802.11 for Noisy Environments



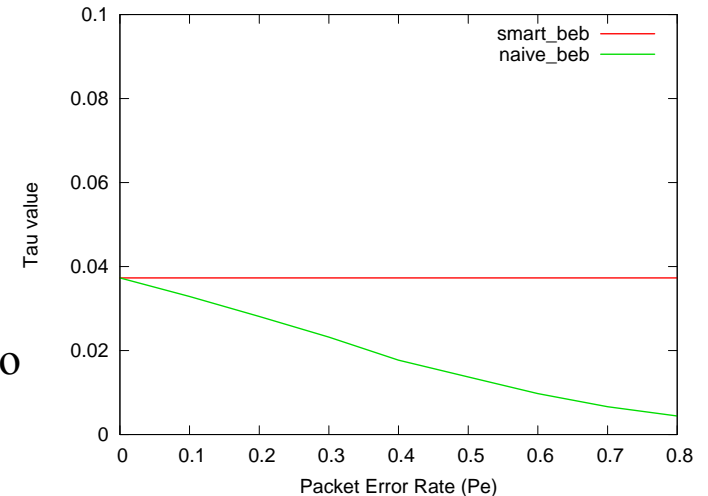
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# Enhancement of IEEE 802.11 DCF in Noisy Environments

- In noisy environments, large number of unsuccessful transmissions are due to noise corruption
- IEEE 802.11 doesn't differentiate between packet loss due to *packet collision* or *packet error*.
  - BEB doubles CW range in the cases of packet errors → unnecessary large idle slots
  - performance degradation
- Propose a new mechanism to enhance the standard 802.11 BEB mechanism ( $\text{BEB}_{\text{naive}}$ ) capable of differentiating between the collision loss and the error loss
  - BEB will double the contention window *only* for the case of the collision ( $\text{BEB}_{\text{smart}}$ ).

## BEB<sub>smart</sub> Implementation (Basic access)

- Using a Markov chain model to model BEB, we calculate the probability a node transmits in a randomly chosen time slot,  $\tau$ .
- Mechanism:
  - Each node calculates  $\tau_{\text{ideal}}$
  - Each node maintains a parameter  $p$ , initially set to zero.
  - When ACK is missing, node doubles the contention window with probability  $(1 - p)$  and resets its  $CW$  to  $W_0$  with probability  $p$ .
  - Each node measures its  $\tau$  every  $T$  time slots.
  - If  $\tau > \tau_{\text{ideal}} \rightarrow$  too *frequent* transmissions  
 $\rightarrow$  few idle slots  $\rightarrow$  Decrease  $p$  by  $\delta$
  - If  $\tau < \tau_{\text{ideal}} \rightarrow$  too *few* transmissions  
 $\rightarrow$  large idle slots  $\rightarrow$  Increase  $p$  by  $\delta$

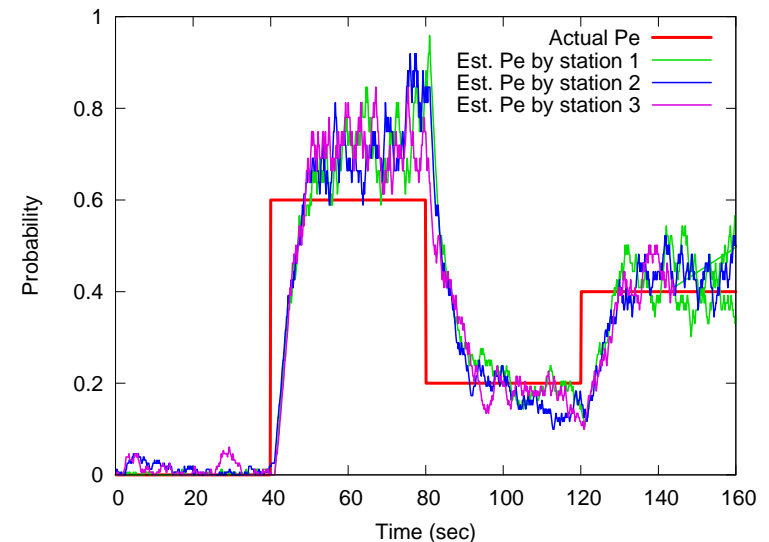
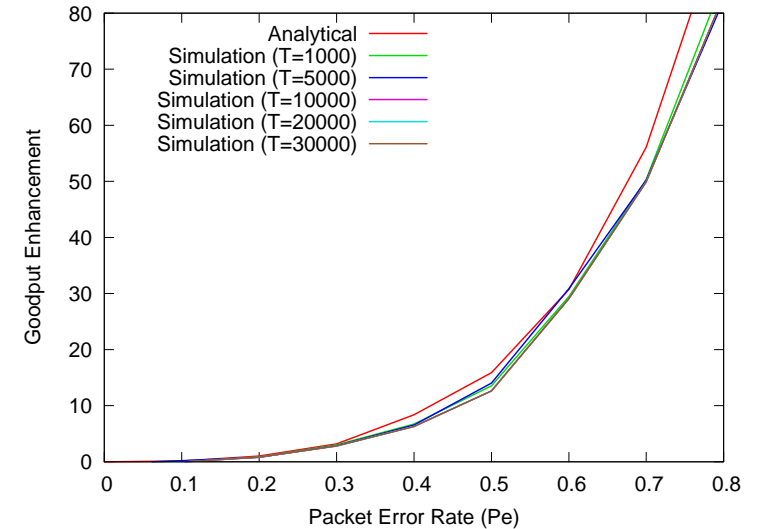


# Simulation Results

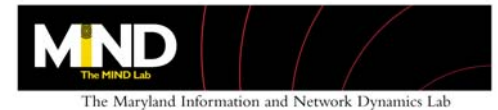
- 10 nodes transmitting data packets of size 500 bytes at data rate 22Mbps where  $\delta = 0.01$ .
- $p$  is the percentage of the dropped packet assigned to the noise corruptions only.

$$p = \frac{(1 - p_c)p_e}{p_c + p_e - p_c p_e}$$

- From the maintained parameter  $p$ , a node can estimate its packet error rate  $p_e$



# Location-aware Enhanced DCF (LED)





# Introduction

- IEEE 802.11 DCF is based on Carrier Sense Multiple Access (CSMA) mechanism
  - a station may transmit if and only if the medium is sensed to be idle.
  - not efficient in shared channel use due to its overcautious approach.
- Capture Effect:
  - When two transmissions are received by the same receiver, the signals of stronger transmission will capture the receiver modem, and signals of the weaker transmission will be rejected as noise.
- Capture Model:
  - Captures a particular transmission if the received energy  $P_r$  sufficiently exceeds all  $n$  other combined received energy. This ratio  $\alpha$  is called the *capture ratio*.

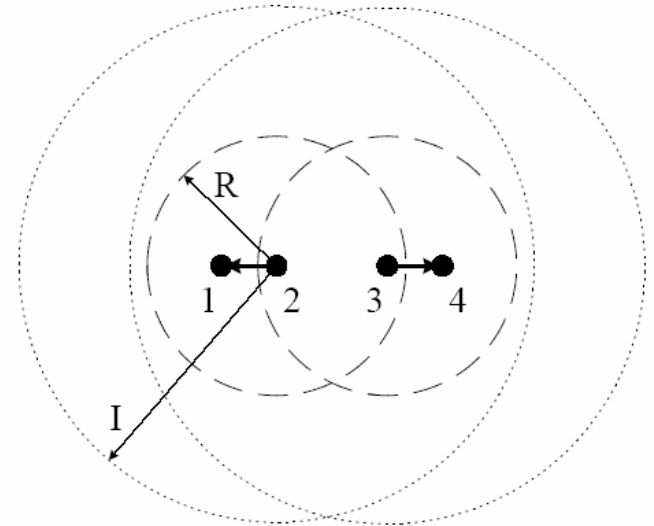
$$P_r > \alpha \sum_{i=1, i \neq r}^n P_i$$



## Introduction (contd')

### EXAMPLE

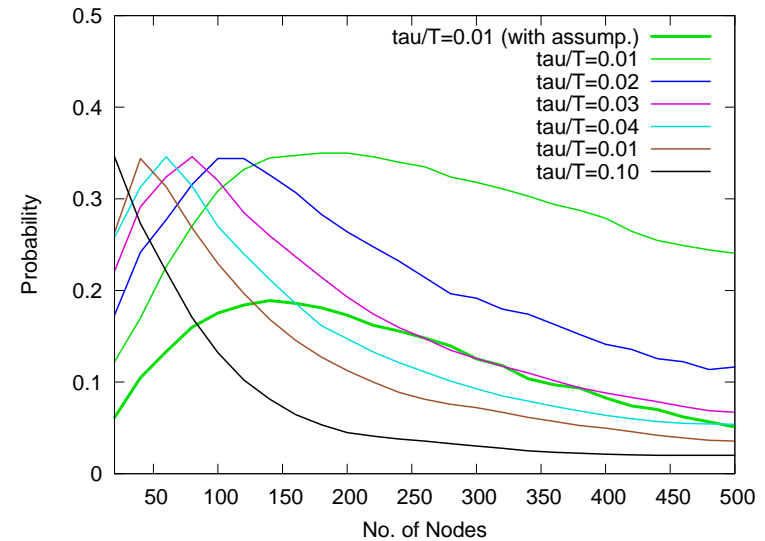
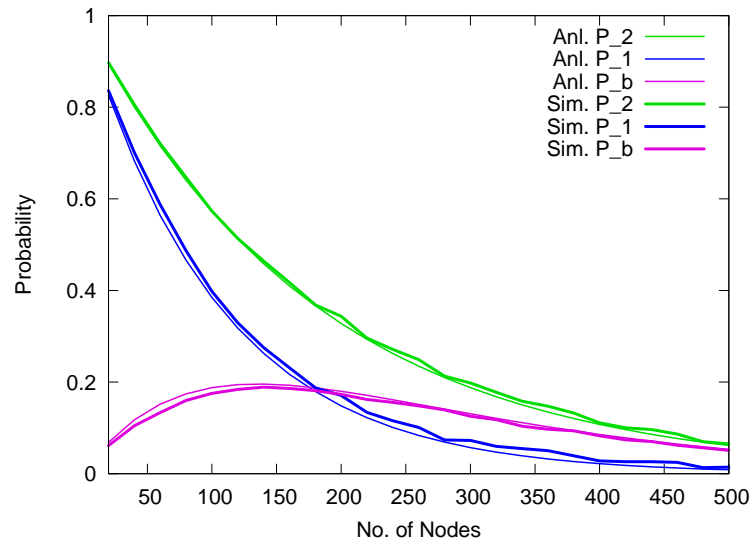
- Two concurrent connections share the same wireless communication channel. The first is from station 2 to station 1 and the second is from station 3 to station 4
- In IEEE 802.11 DCF, once a connection seizes the channel, the other connection would have detected the carrier signals of this connection and remain blocked.
- However, if stations are positioned in such a way that the energy levels of stations 3 and 4's transmissions as measured at stations 1 and 2 are not strong enough that stations 1 and 2 can still capture each other's transmissions → both connections can go simultaneously





# Analysis of Blocking Probabilities with Capture Effect

- Using a conservative model, we analytically studied the probability a node, detecting on going transmissions, can transmit without corrupting others.
- Verified the analytical results using simulation.
- Studied a realistic model using simulation.



# LED Mechanism

- Physical Layer Design
  - Unlike regular IEEE 802.11 PHY designs, a receiver is able to correctly detect and capture a strong frame regardless of the current state of the receiver, for example, “Message-In-A-Message” (MIM) support.
- MAC Layer Design
  - insert a block of information called ENH (“Enhanced”) as part of the PLCP header to provide the additional information needed for the LED.
  - When other stations overhearing ENH information, they are able to better assess whether their own transmissions may harm this ongoing delivery or not.

# LED Mechanism

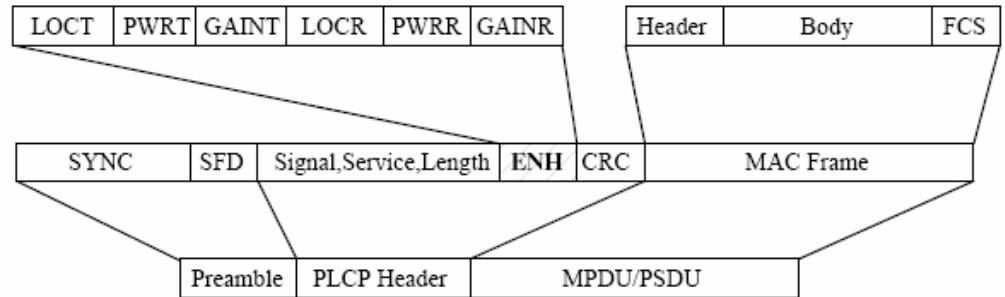


Fig. 9. Frame structure

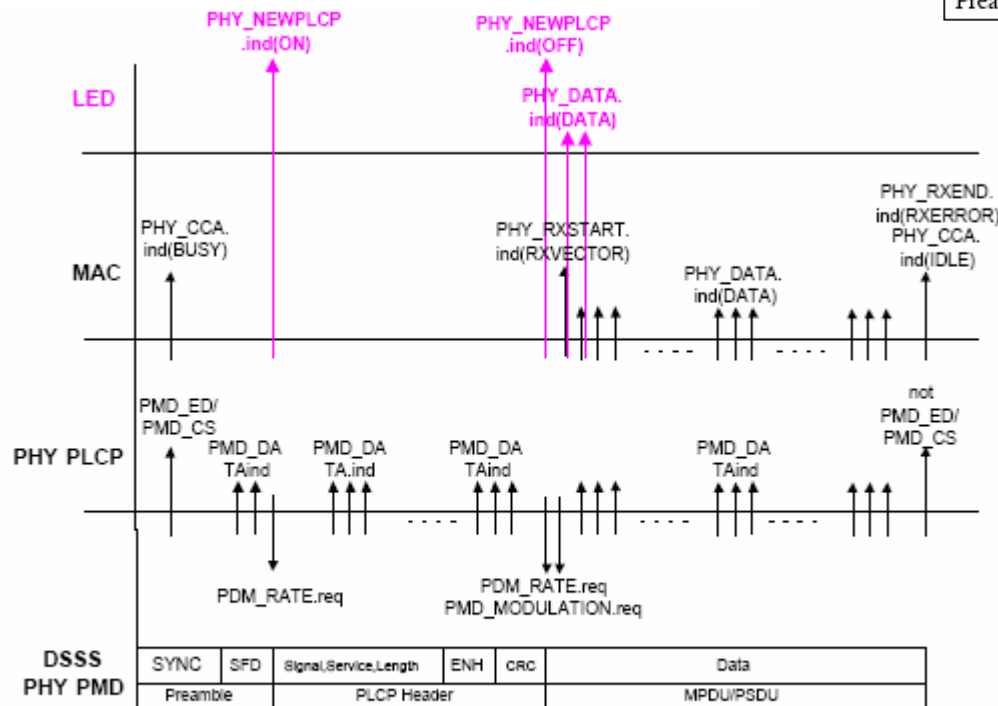


Fig. 10. PHY-MAC interactions

# Performance Evaluation

- NS-2, simulation parameters
  - Variable number of nodes.
  - Area of 1000x1000m<sup>2</sup>
  - UDP connections, 1000 bytes with different rate
  - Data rate is 11Mbps
- Schemes
  - Original IEEE 802.11
  - MACAW
  - LED\_CS: a station receiving a frame it cannot decode, assumes its transmission will not interfere with that ongoing delivery.
  - LED\_RX: a station assumes its transmission will interfere with the ongoing delivery under receiving a frame it cannot decode.
- Capture ratio  $\alpha$  is set to 5, Transmission Radius=250m, Interference Radius=550m
- Simulation time is 50 seconds.
- Each point in the results is the average of 10 runs.

# Performance Evaluation (contd')

- Various number of connections, each with UDP rate of 20 packets per second.

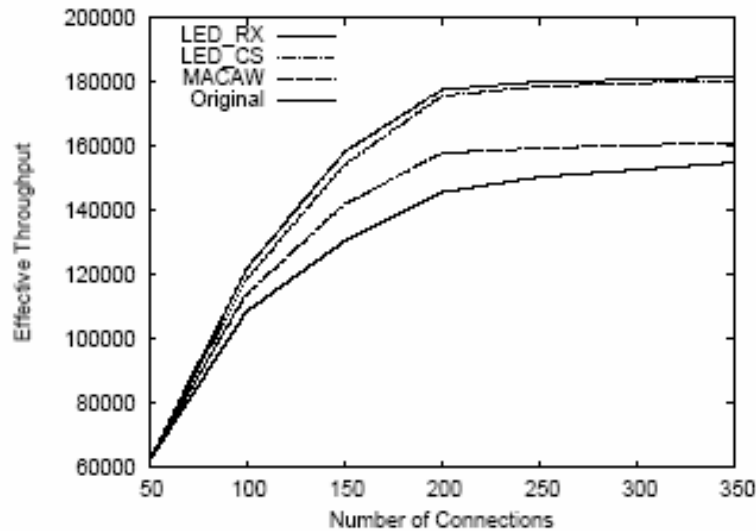


Fig. 12. Effective throughput versus node density

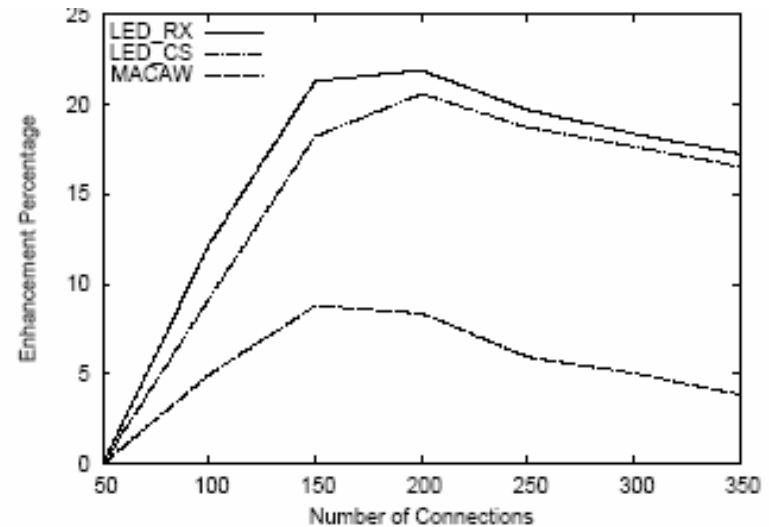


Fig. 13. Throughput enhancement over Original mechanism versus node density using RTS/CTS access mode

# Performance Evaluation (contd')

- 50 UDP connections, each with various packet rates.

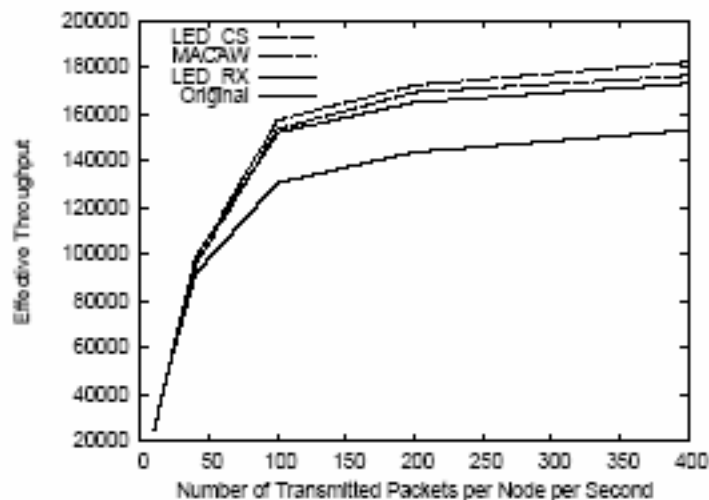


Fig. 16. Effective throughput versus network load using RTS/CTS access mode

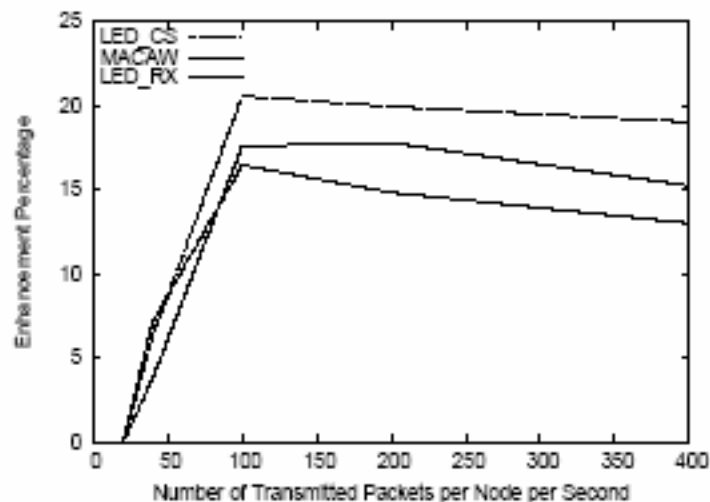
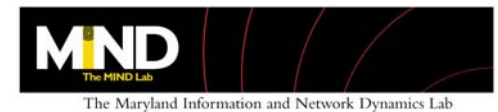


Fig. 17. Throughput enhancement over Original mechanism versus network load using RTS/CTS access mode



WiFiTC

# WiFi Traffic Characterization



The Maryland Information and Network Dynamics Lab

## Measurement Setup

- Location: 4<sup>th</sup> floor, A.V. Williams Bldg
- Duration: Feb 9 (Monday) 0 am – Feb 22 (Sunday) 12 pm (2 weeks)
- Target traffic: Wireless LAN traffic of one umd AP (at Rm. 4149) on Channel 6
- Methodology:
  - Three wireless sniffers at Rm. 4140 (closest to the AP), Rm. 4166, and Rm. 4132
  - Wireless sniffers capture MAC traffics
  - Merging three sniffers to reduce the measurement losses

# 802.11 Traffic Characterization

- Previous results: characterization of traffic, error, types, frame size, and data rate on only MAC layer
- New results:
  1. Above-MAC Layer Characterization
    - APP, IP, and LLC (Logical Link Control) Layer
  2. Session Analysis
    - Session: A traffic duration of a wireless STA sending/receiving, which is expired when the STA not send/receive for some time threshold (e.g. 30 minutes)

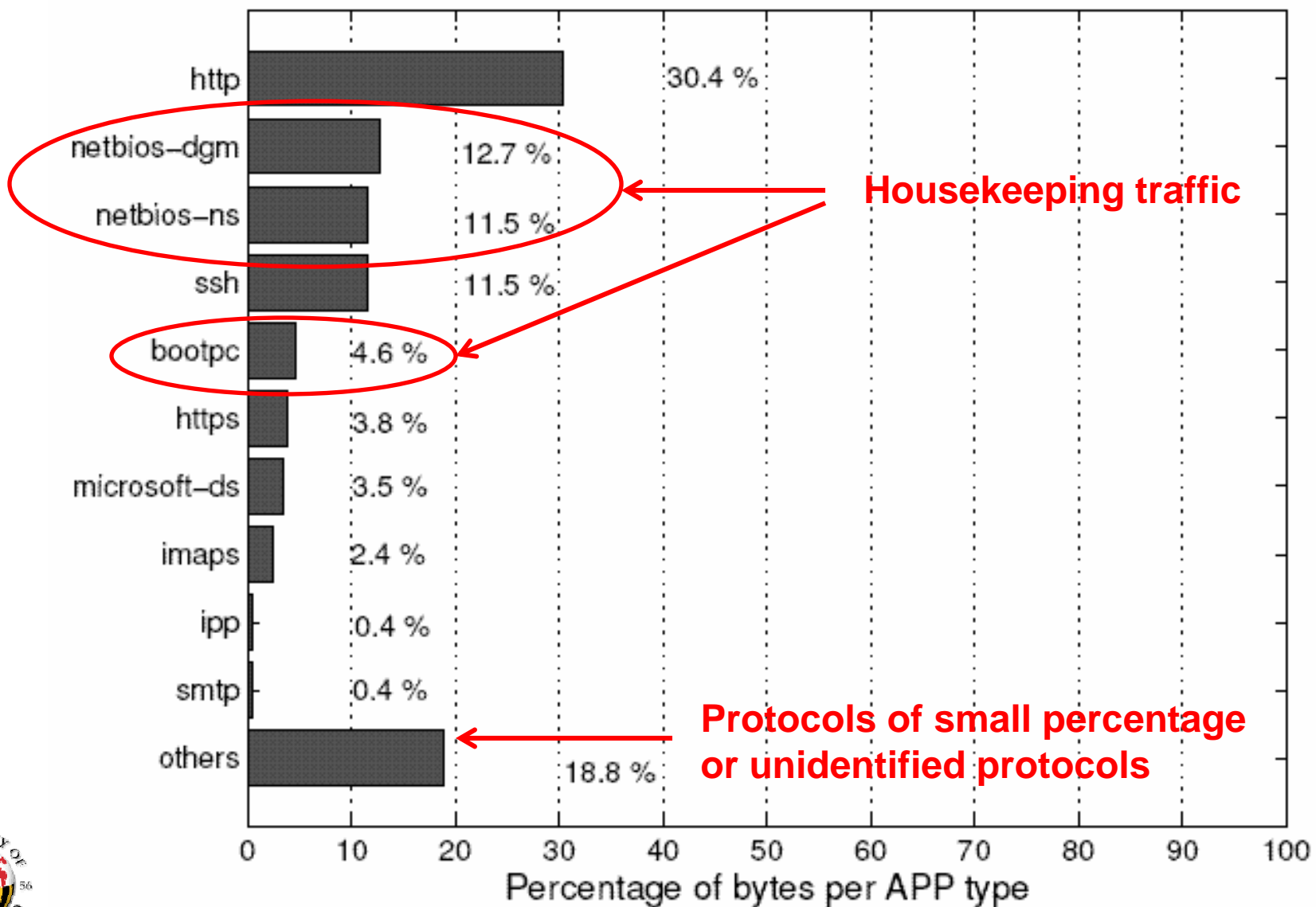


## Above-MAC Traffic Characterization

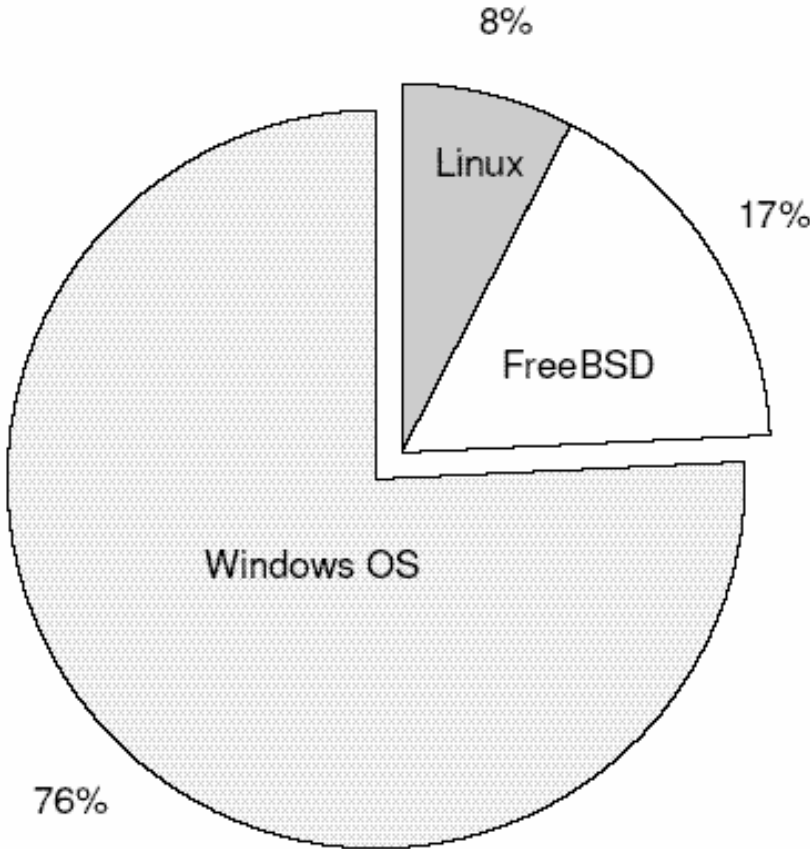
- APP protocol mix
  - About 40% in bytes are housekeeping traffic (NetBios, boot protocol, etc) for windows name/browse service and bootstrap, etc.
  - About 50% in bytes are used for well-known user applications (http, ssh, email, file share, etc)
  - 76% of wireless STAs run Windows OS.
- IP protocol mix
  - 16% in number are used for VPN connection.
- LLC type mix
  - ARP (Address Resolution Protocol) traffic amounts to 19% in number, 6% in bytes.
  - IP frame size: From-AP has larger than To-AP due to (small) request/ (large) response.



## APP Protocol Histogram



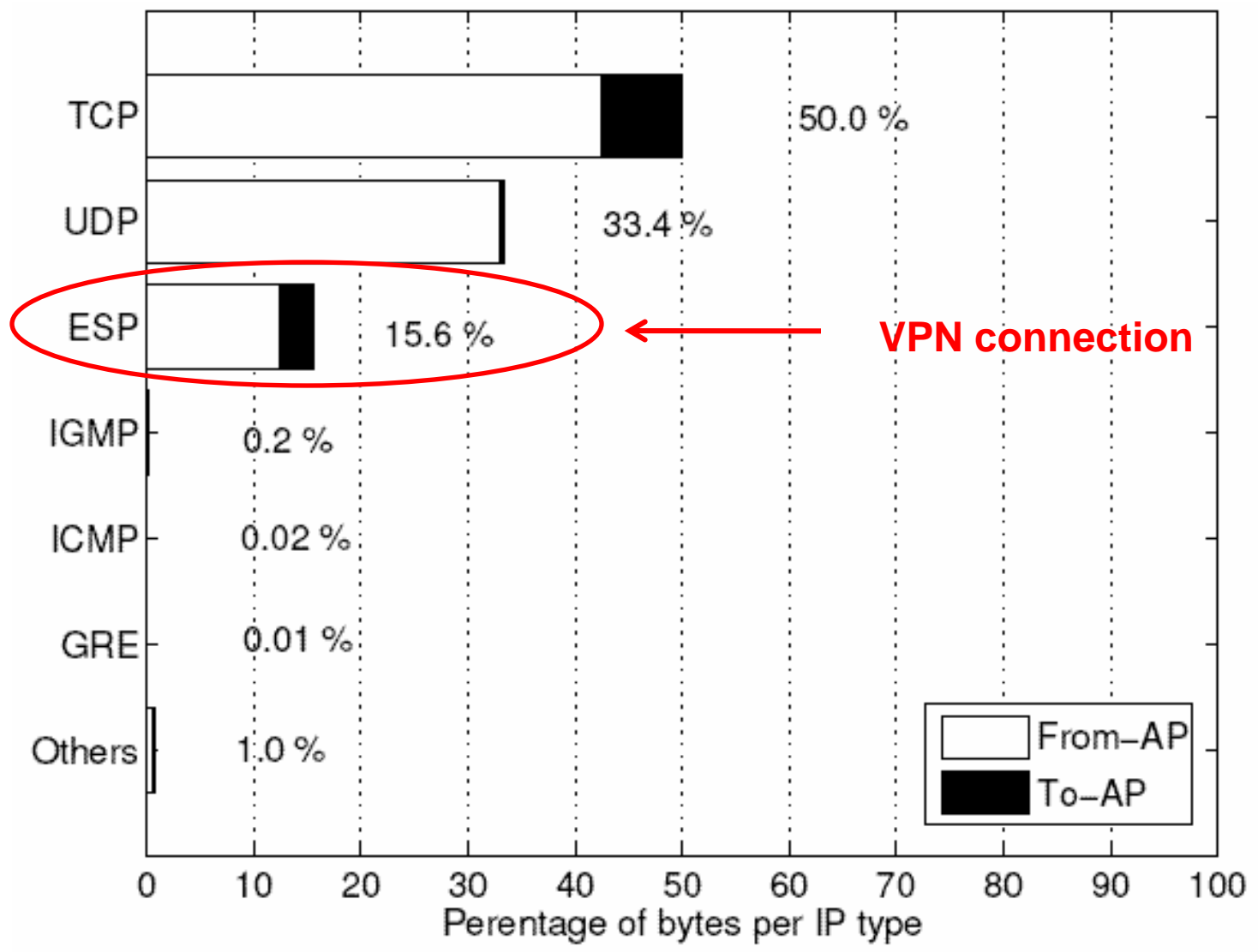
# OS Distribution



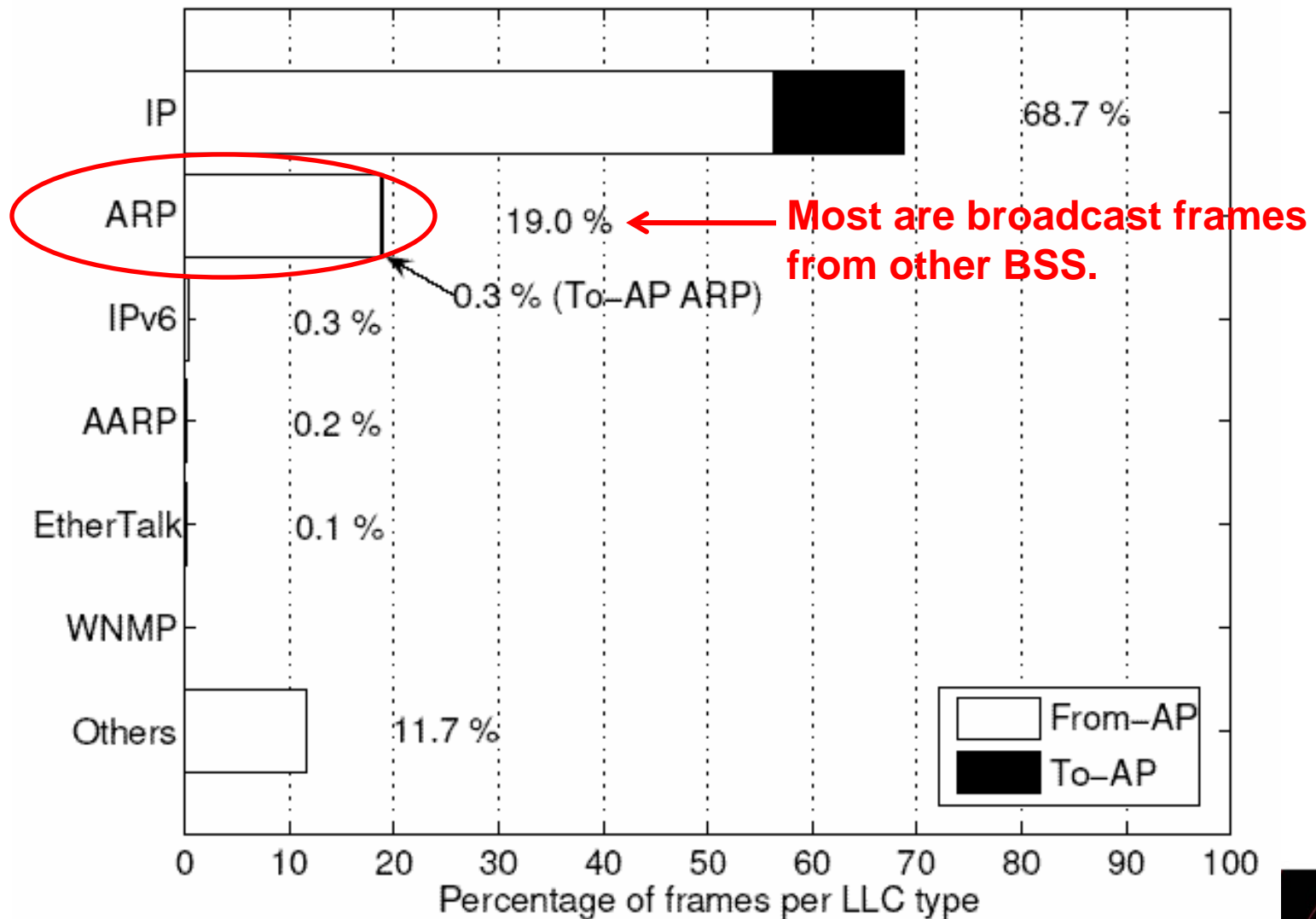
- Identified by analyzing TCP traffic with OS fingerprinting tool (p0f)



## IP Protocol Histogram

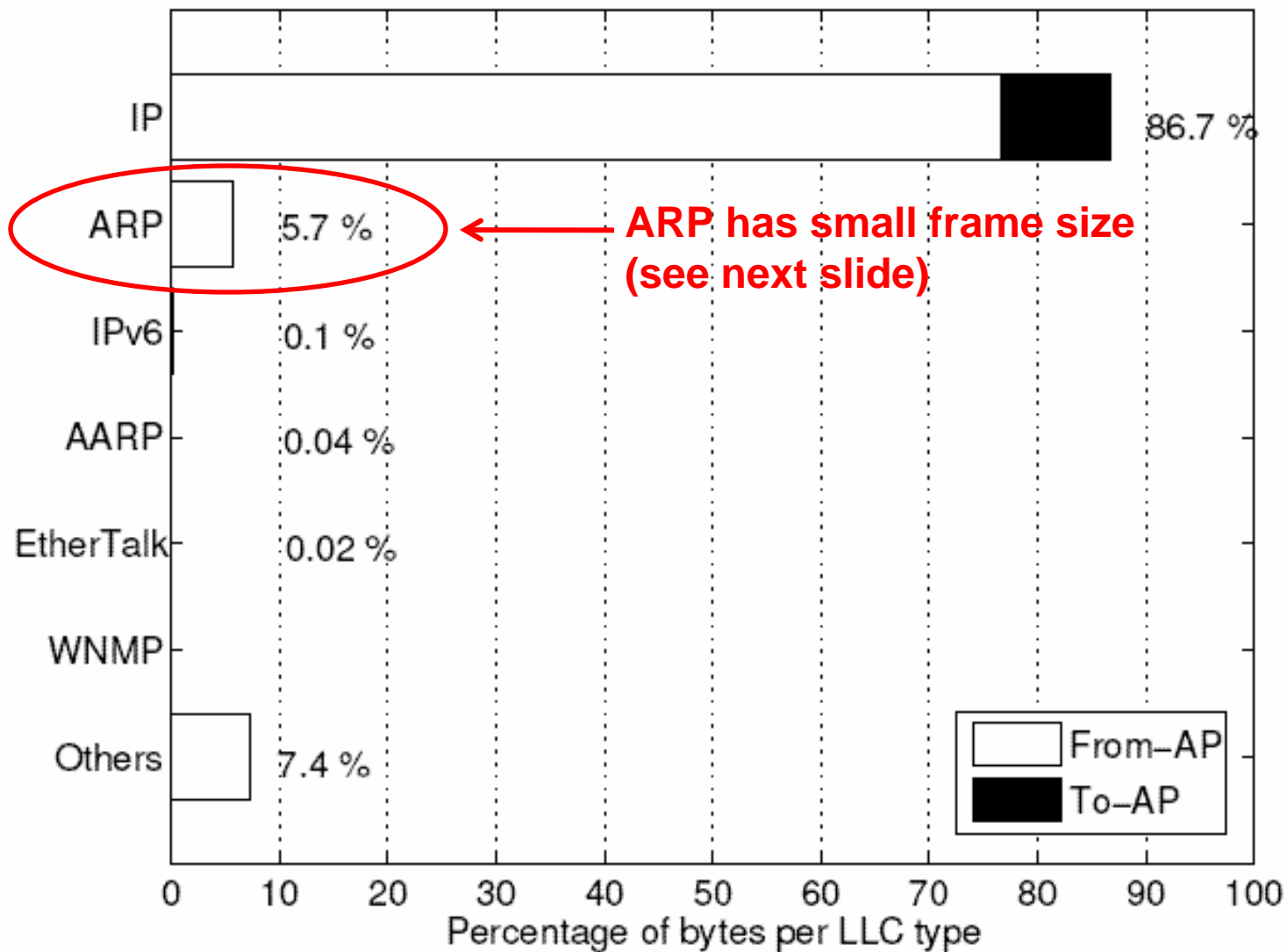


## LLC Type Histogram

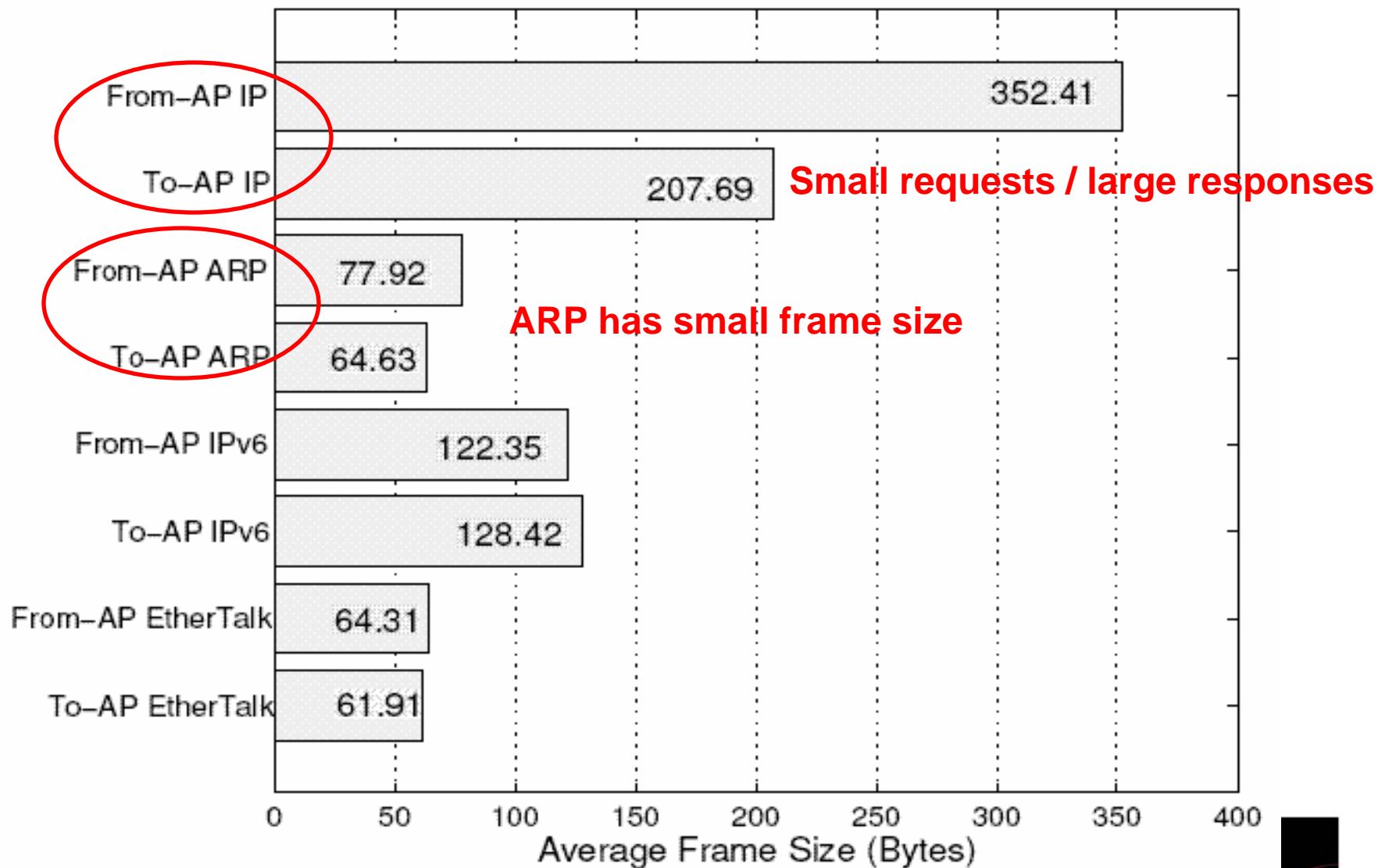




## LLC Type Histogram (in Bytes)



## LLC Average Frame Size



# Session Analysis

- Session: A traffic duration of a wireless STA sending/receiving, which is expired when the STA does not send/receive for some time threshold (e.g. 30 minutes)
- Advantages: grouping into homogeneous traffic units helps characterization.
- Session Analysis
  - Per-protocol session analysis : aim to characterize each protocol traffic in wireless LAN.
  - Session clustering analysis (on-going work) : aim to characterize a typical one-AP wireless LAN traffic.

## Per-Protocol Analysis

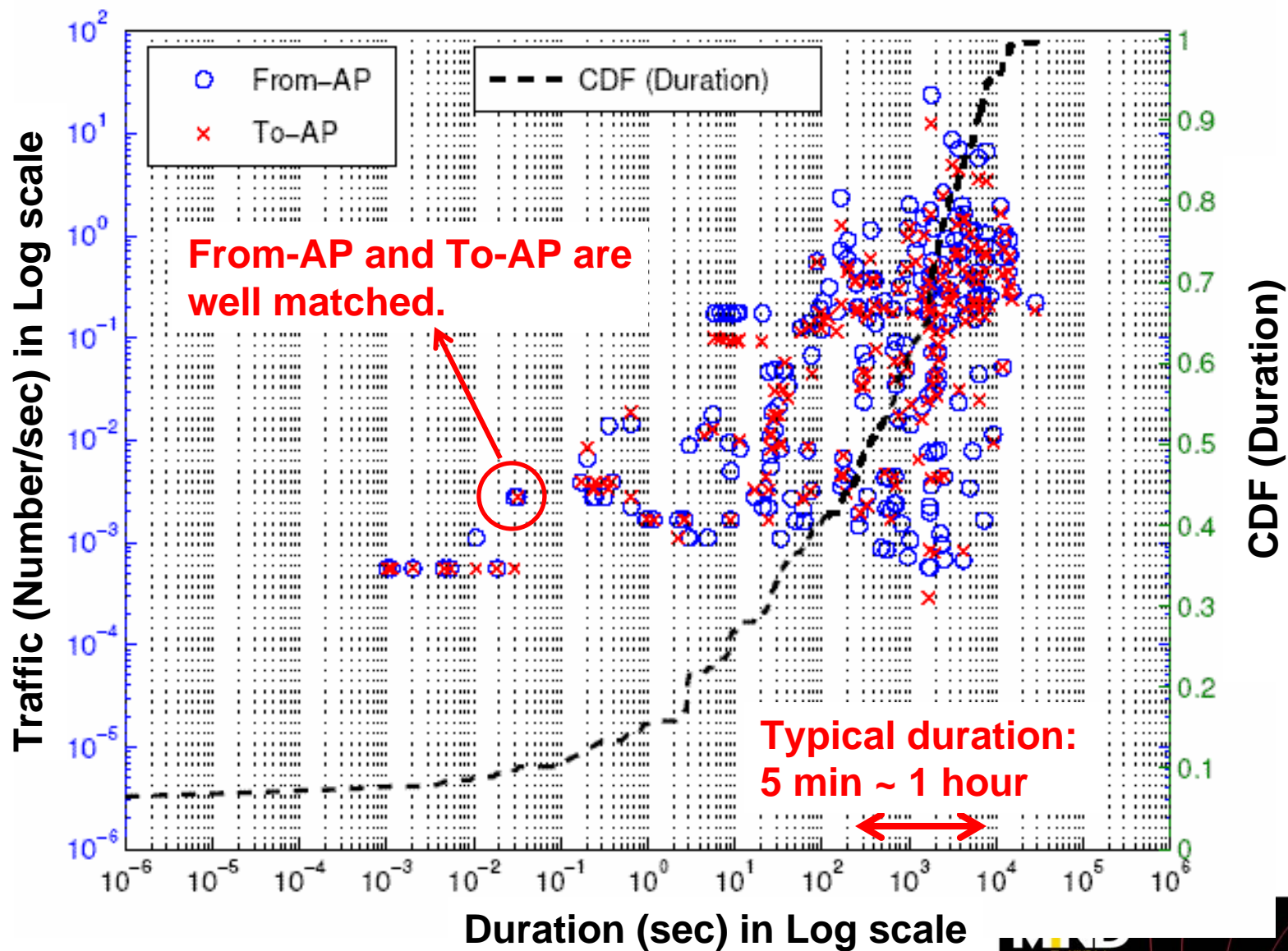
- Traffics in wireless LAN consists of
  - **User** traffic (34% in number of frames): generated by human users, e.g. HTTP, SSH, IMAPS (email), ESP (vpn), etc.
  - **Broadcast** traffic (53% in number of frames): generated by machines for requests to **all**, responses from any, e.g. NetBios (windows name/browse **service**), ARP (address resolution), MAC Probe, etc.
  - **Multicast** traffic (13% in number of frames): generated by machines for requests to **some**, responses from them, e.g. Srvloc (service location), IGMP (group mgmt), ICMP (network discovery), etc.



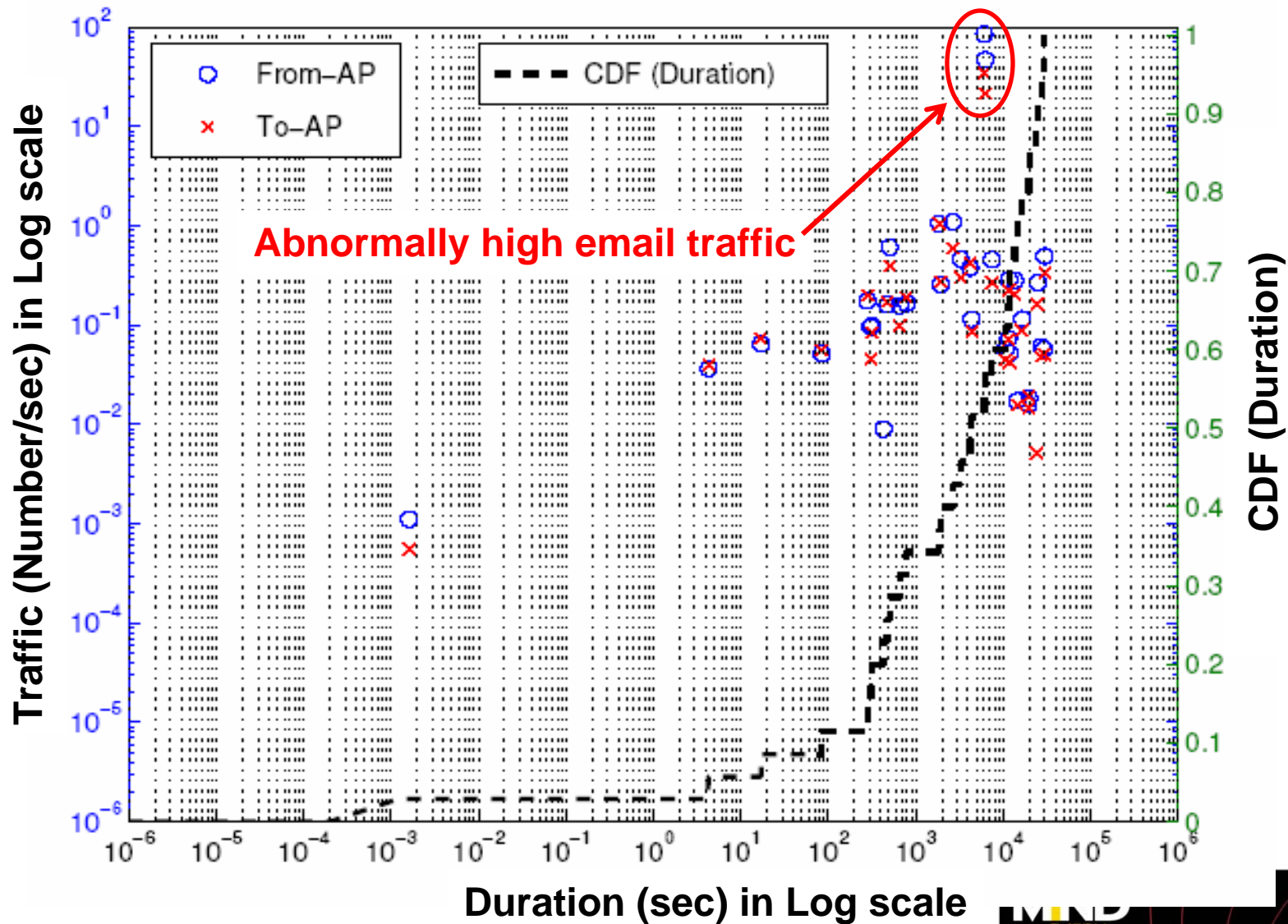
## User Protocol Session Characteristics

- 34% in number of frames.
  - http/https, ssh, imaps (email), esp (for vpn), etc.
- Typical Characteristics
  - High traffic
  - From-AP/To-AP traffics are well matched for unicast request/response.
  - Session duration: around 1 hour
- Other observations
  - IMAP spike
    - Some IMAP sessions have as large traffic as order of 2.
    - Inferred to be email worm (W32.Netsky.B@mm)

## User Protocol Sessions (HTTP)



## User Protocol Sessions (IMAPS)

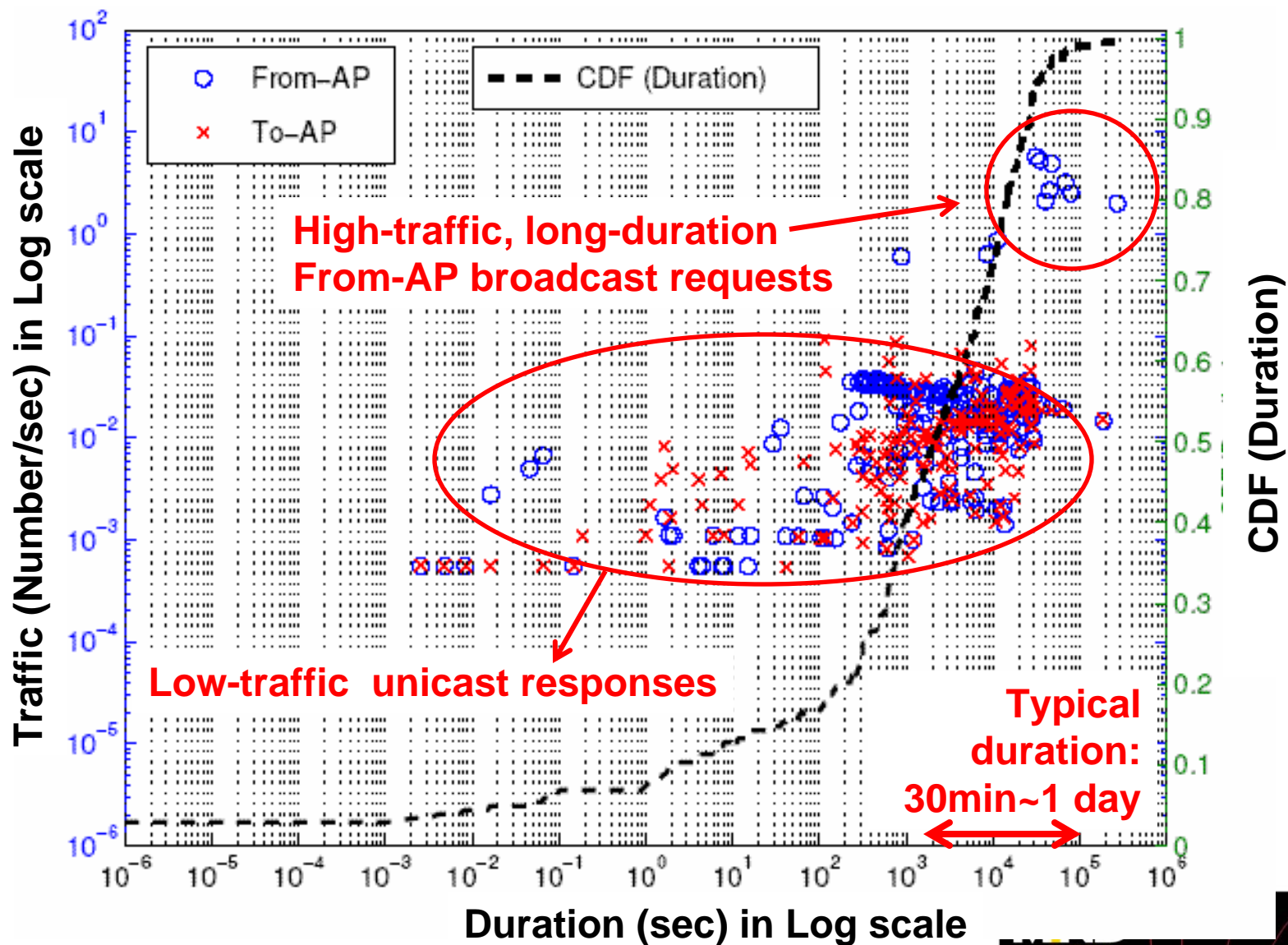


## Broadcast Session Characteristics

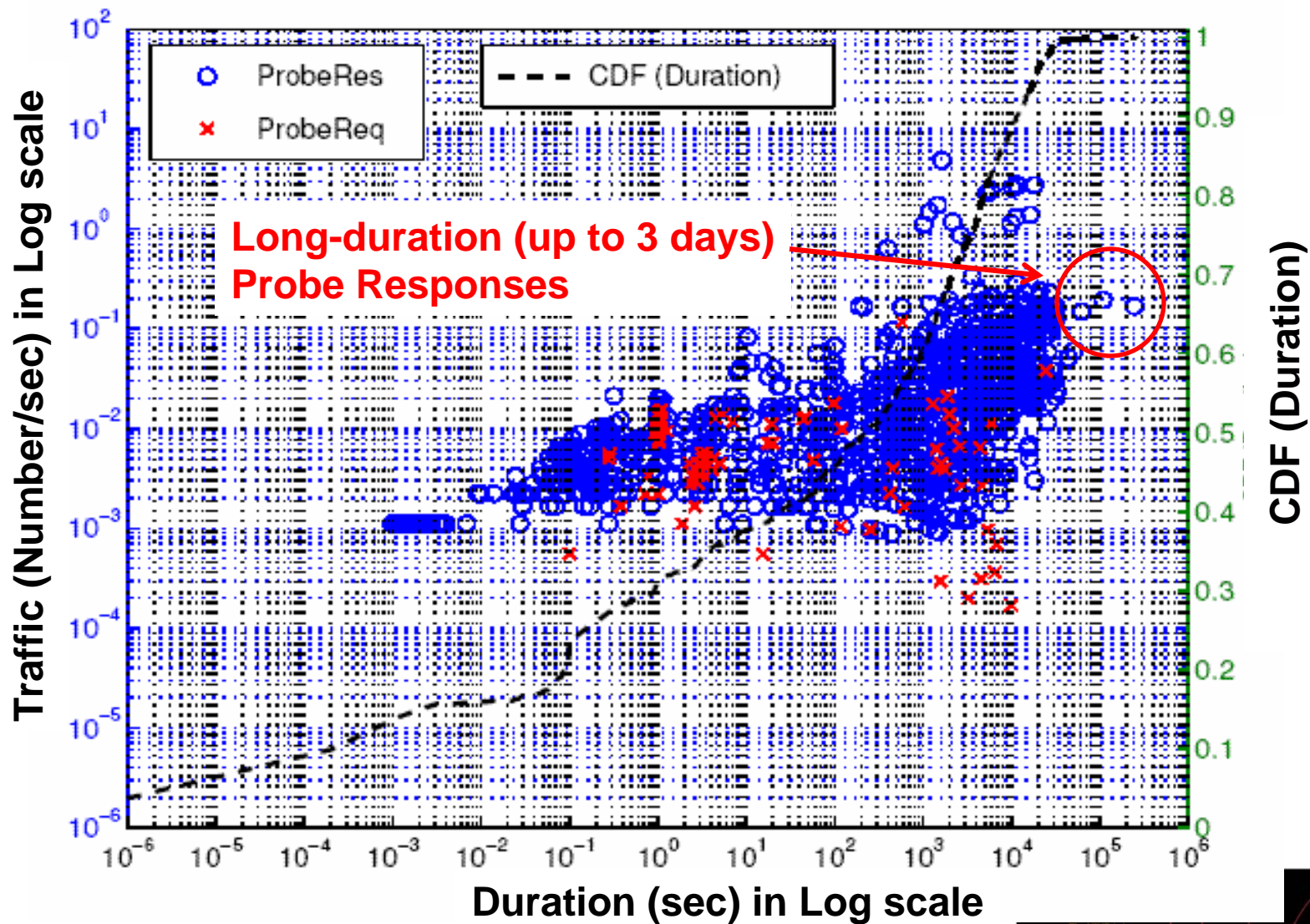
- 53 % in number of frames.
  - Netbios, bootp, arp, probe, etc.
- Typical Characteristics
  - Medium traffic
  - Most traffic are From-AP, due to broadcast request/ unicast response.
  - Long session duration: longer than 2 hours
- Other observations
  - Long Probe sessions
    - Some STAs in border of APs frequently and continuously (as long as **3 days!**) send Probe Requests
    - AP can hear Probe Request messages from even far-away STAs, sending Probe Responses.



## Broadcast Sessions (ARP)



## Broadcast Sessions (Probe)

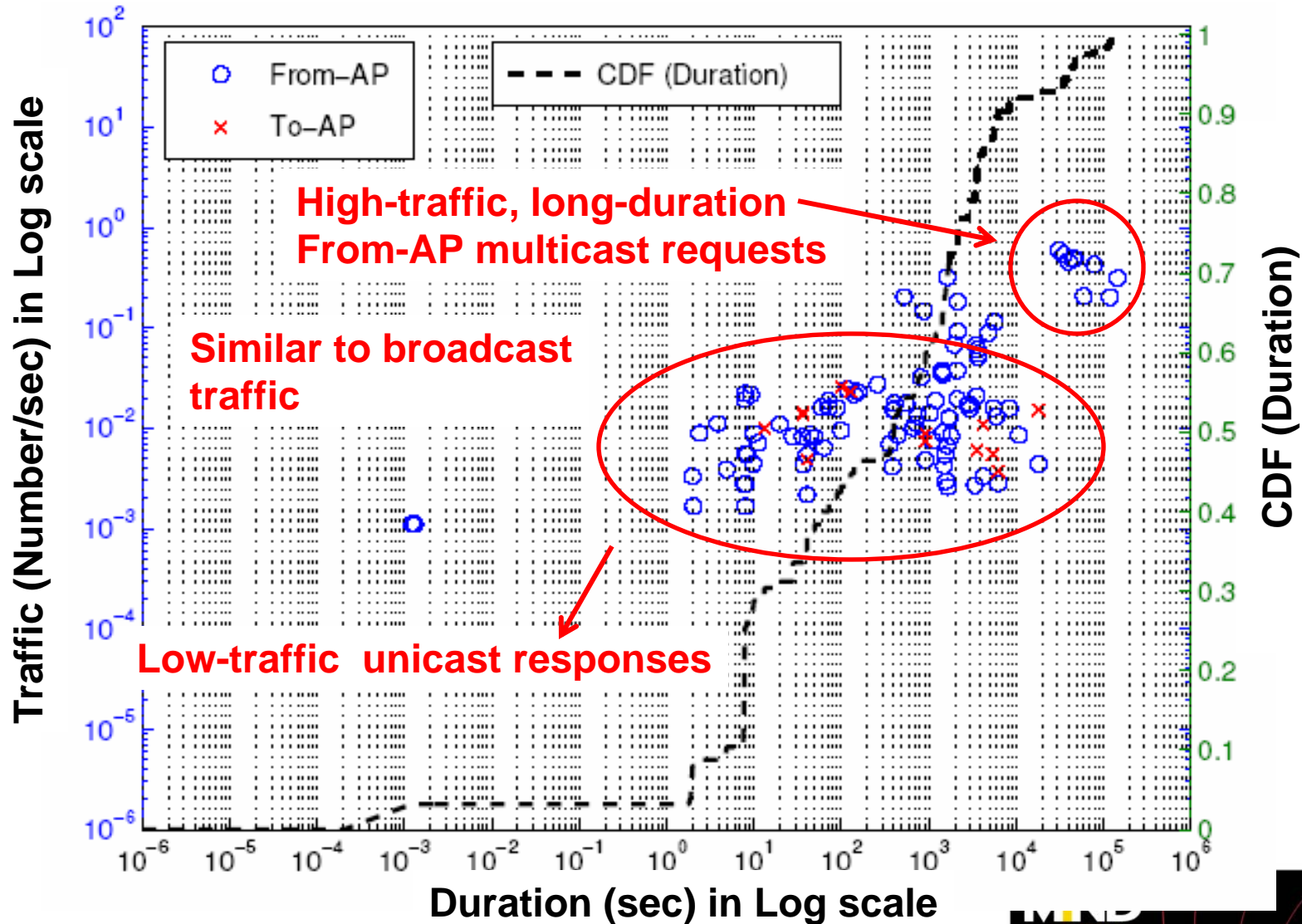


# Multicast Session Characteristics

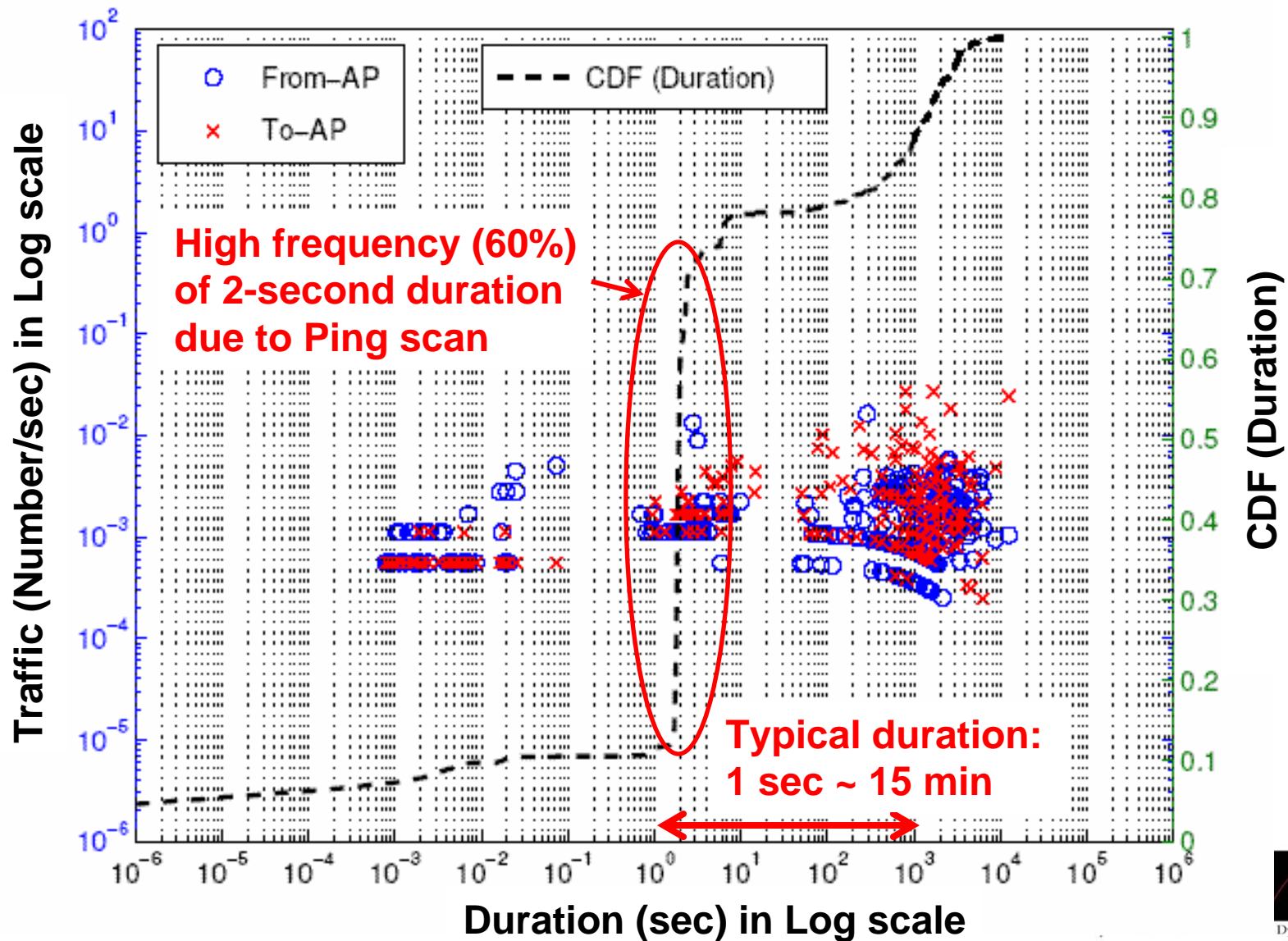
- 13% in number of traffics.
  - srvloc, igmp, icmp, ipv6, etc.
- Typical Characteristics
  - Small traffic
  - Multicast traffic using well-known addresses: similar to broadcast – long duration From-AP sessions.
  - Multicast traffic for network discovery: instant-lived sessions.
- Other observations
  - ICMP (ping) scans
    - Some STA outside the target BSS sends ping messages to arbitrary, synthetic (multicast) addresses.
    - Generate significant number of short (2-second) sessions.
    - Potentially malicious.



## Multicast Sessions (srvloc) : when well-known multicast addresses used

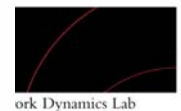
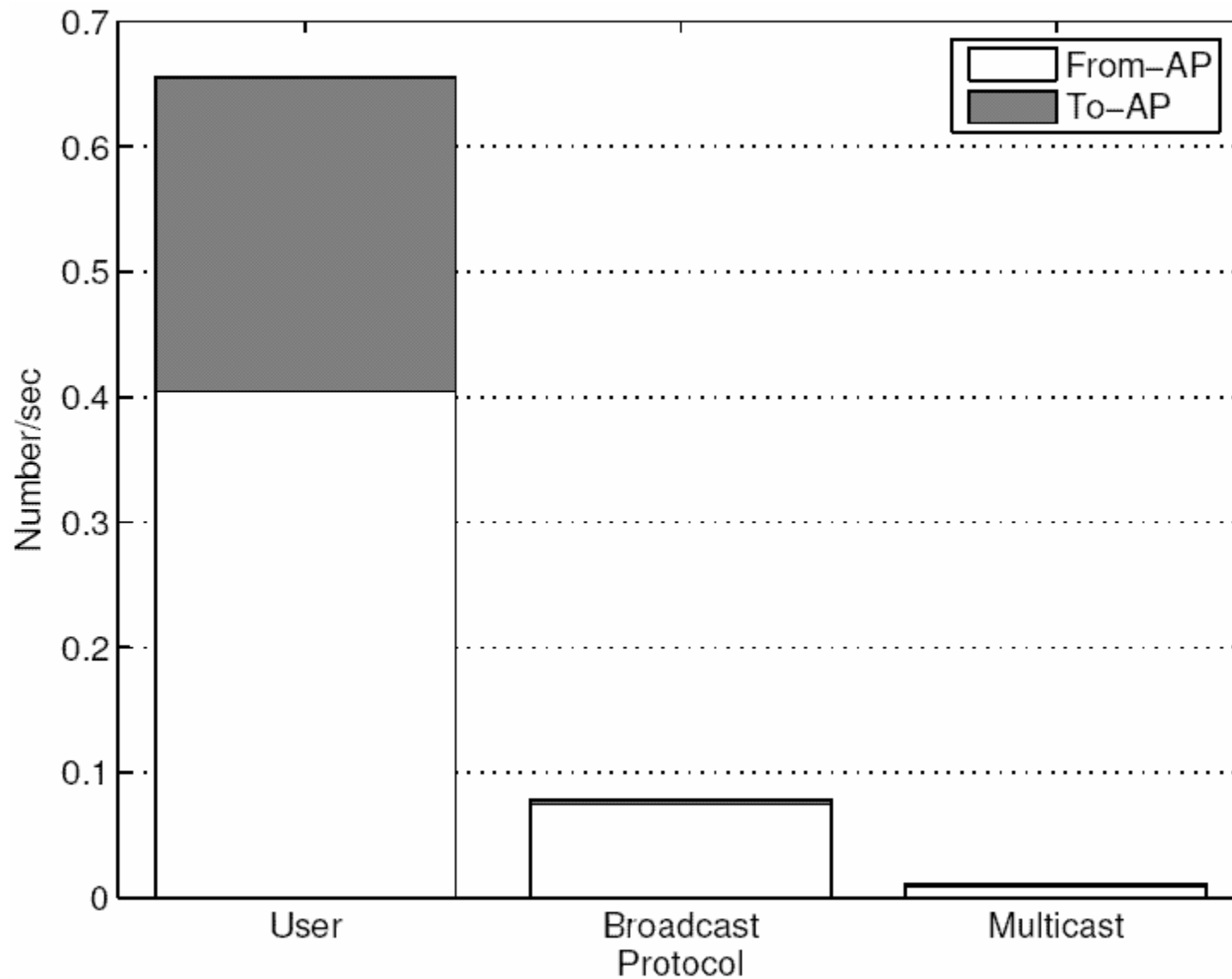


## Multicast Sessions (ICMP): for network discovery purpose

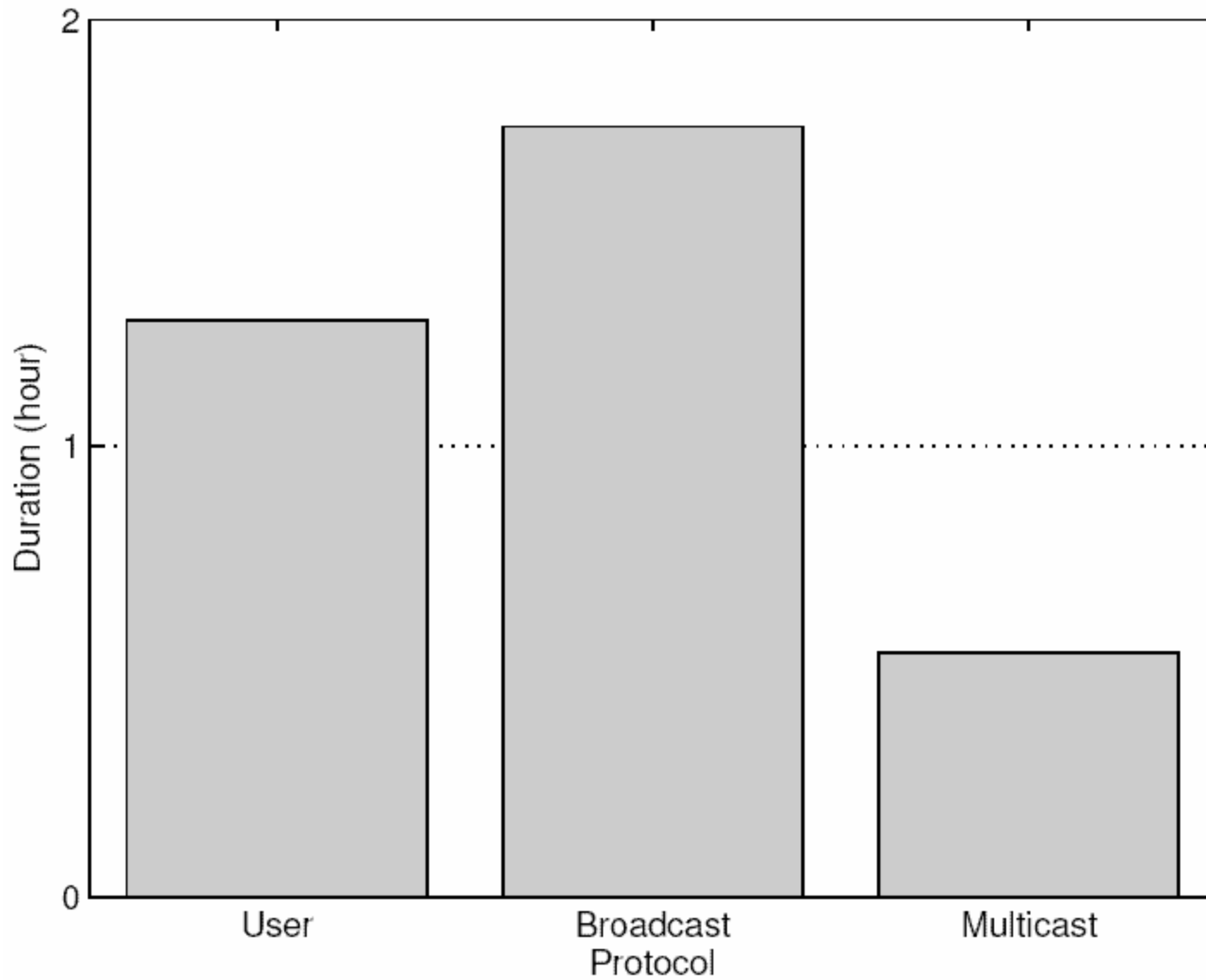


# WiFiTC

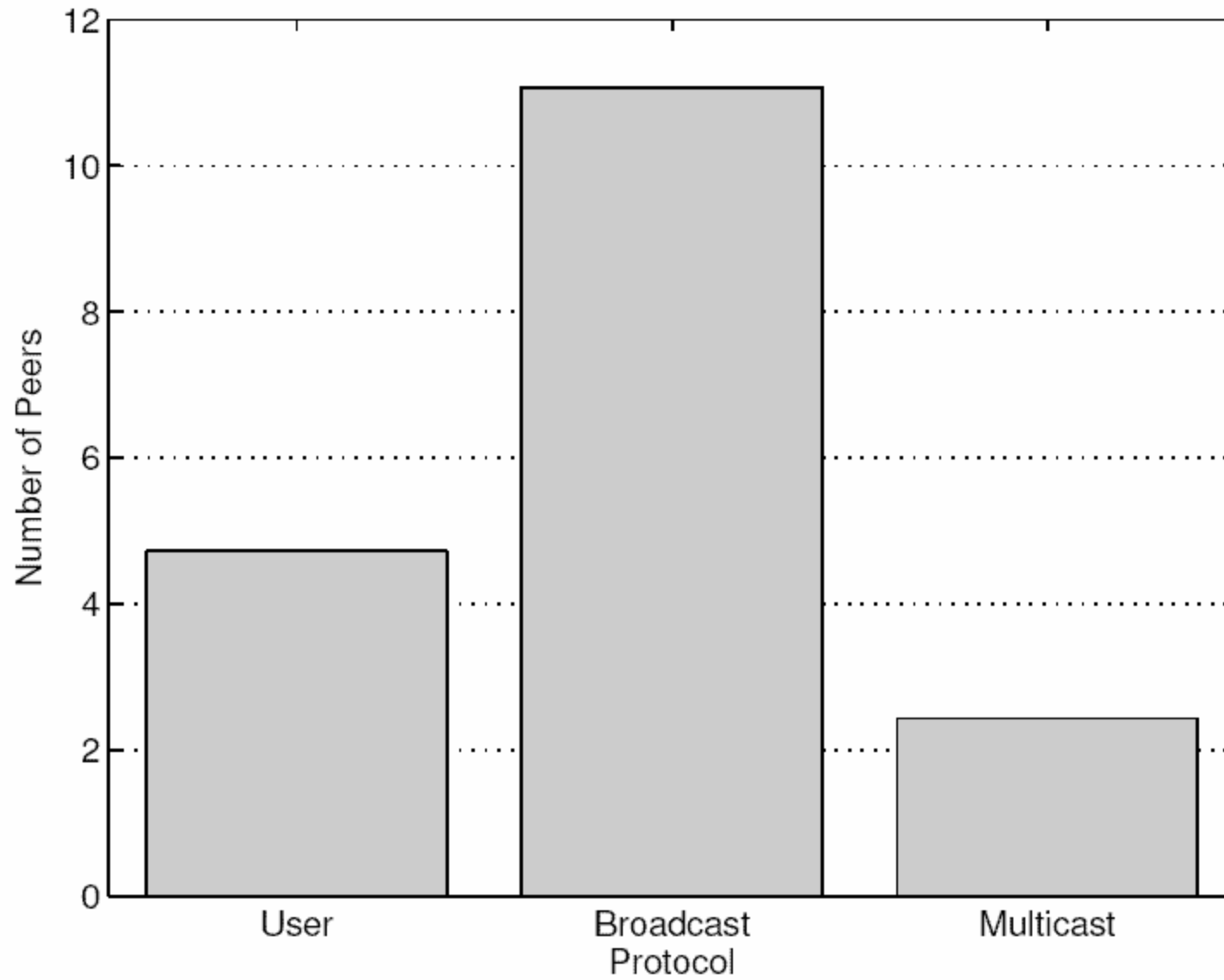
## Mean Session Traffic (number/sec)



## Mean Session Duration (hour)



# Mean Number of Peers





# Session Clustering Analysis

- Generate sessions on all (protocol-mixed) traffic
- Apply adaptive clustering algorithm with 4 features:
  - From-AP number of frames/sec
  - To-AP number of frames/sec
  - Number of distinct peers
  - Session duration (sec)
- Successfully classify wireless LAN traffic into a small number of characteristic sets (clusters).



## Conclusion

- We characterize 2-week long WLAN traffics on:
  - MAC and above-MAC Characteristics
  - Session Characteristics
- Actual WLAN has
  - Significant volumes of broadcast/multicast traffic
  - Some potentially malicious traffic (e.g. IMAPS (email) spike, ICMP (ping) scans)
  - Long-duration (as long as 3 days) Probe Response traffic