

# Experimental Analysis and Characterization of a Wireless Sensor Network Environment

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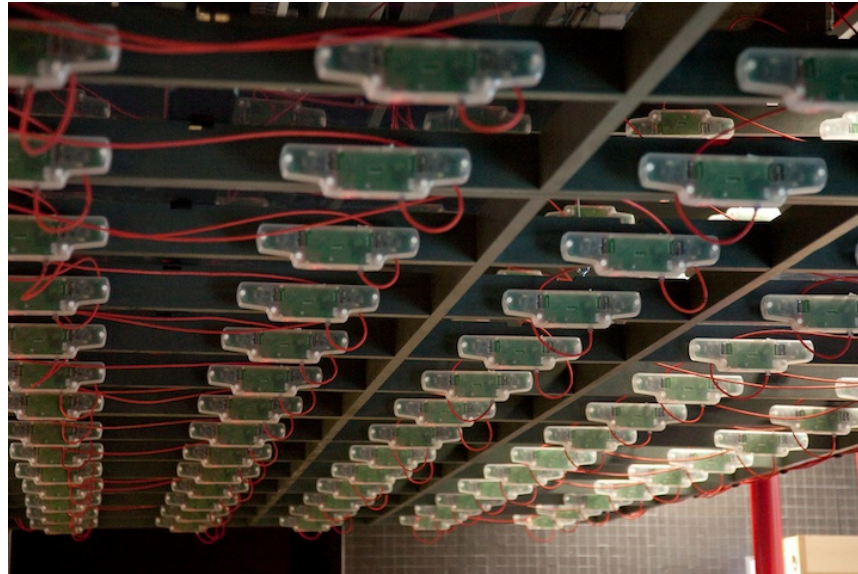


**PE-WASUN – Symposium on Evaluation of  
Wireless Ad Hoc, Sensor, and Ubiquitous Networks**  
17-21 October 2010 – Bodrum, Turkey



# Motivation

- Existing testbeds – rare, specialized and costly + **not fully exploited** [*SensorScope, Mirage, SensLab, WUSTL...*]
- Lack of generic results** – evaluate specific protocol (tested) aspect



Senslab – INRIA Rennes, France

# One step further

## **Statistical analysis:**

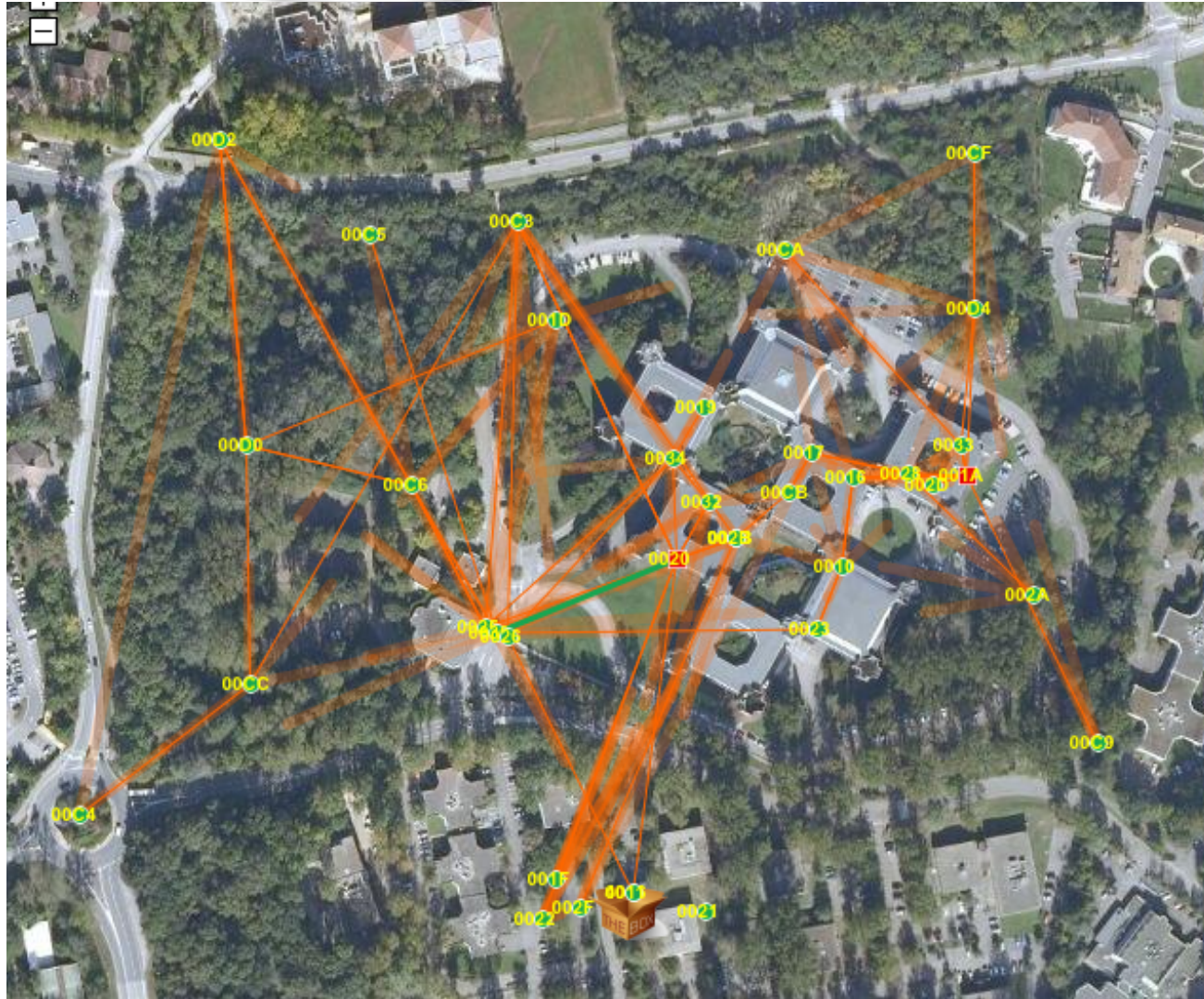
*Real world testbed data traces*

Obtain insight in the WSN environment itself

## **Our analysis includes in particular:**

- ◆ Link properties + correlation with environmental parameters
- ◆ How to predict the link quality?
- ◆ Network dynamics – neighborhood and link evolution
- ◆ How to discard measurement errors?
- ◆ Discuss testbed design

# WSN testbed

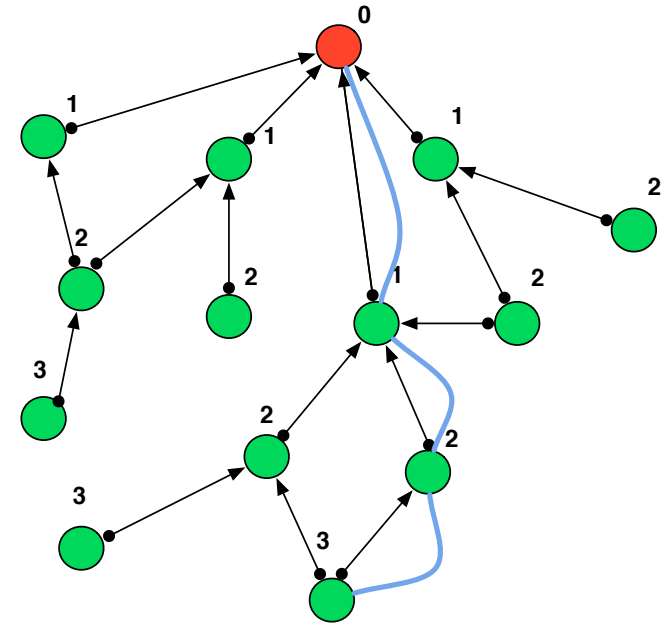


# WSN testbed

- ◆ **Number of nodes (sinks):** 36 (2)
- ◆ **Area:** 500m x 300m
- ◆ **Node position:** Indoor & outdoor
- ◆ **Node type:** Coronis Wavenis
- ◆ **PHY:** 868 MHz ISM at 25mW  
fast frequency hopping

# Protocol details

- ◆ **Routing:** Converge cast  
(gradient virtual coordinates)
- ◆ **MAC:** CSMA-CA
- ◆ **Duration of the experiment:** 18 days
- ◆ **Data packet generation period:** 17 min
- ◆ **Neigh. discovery period:** 13 min.



# Collected data

## Node data:

- ◆ Node ID
- ◆ Geographic position (known a priori)

## Data packet (*successfully received*):

- ◆ Source node ID
- ◆ Neigh. information (ID and RSSI value) - *hello*
- ◆ Sensor measurements (humidity, temp.)
- ◆ Timestamp

# Link samples

## Create:

- 🔹 Each pair of nodes => 2 possible link entries (two way)
- 🔹 Raw data: 16 unidirectional and 280 bidirectional links

## Filter:

- 🔹 *Remove entries with small cardinalities (1% of maximum sample size)*
- 🔹 After clean up: NO uni links!



# Link quality



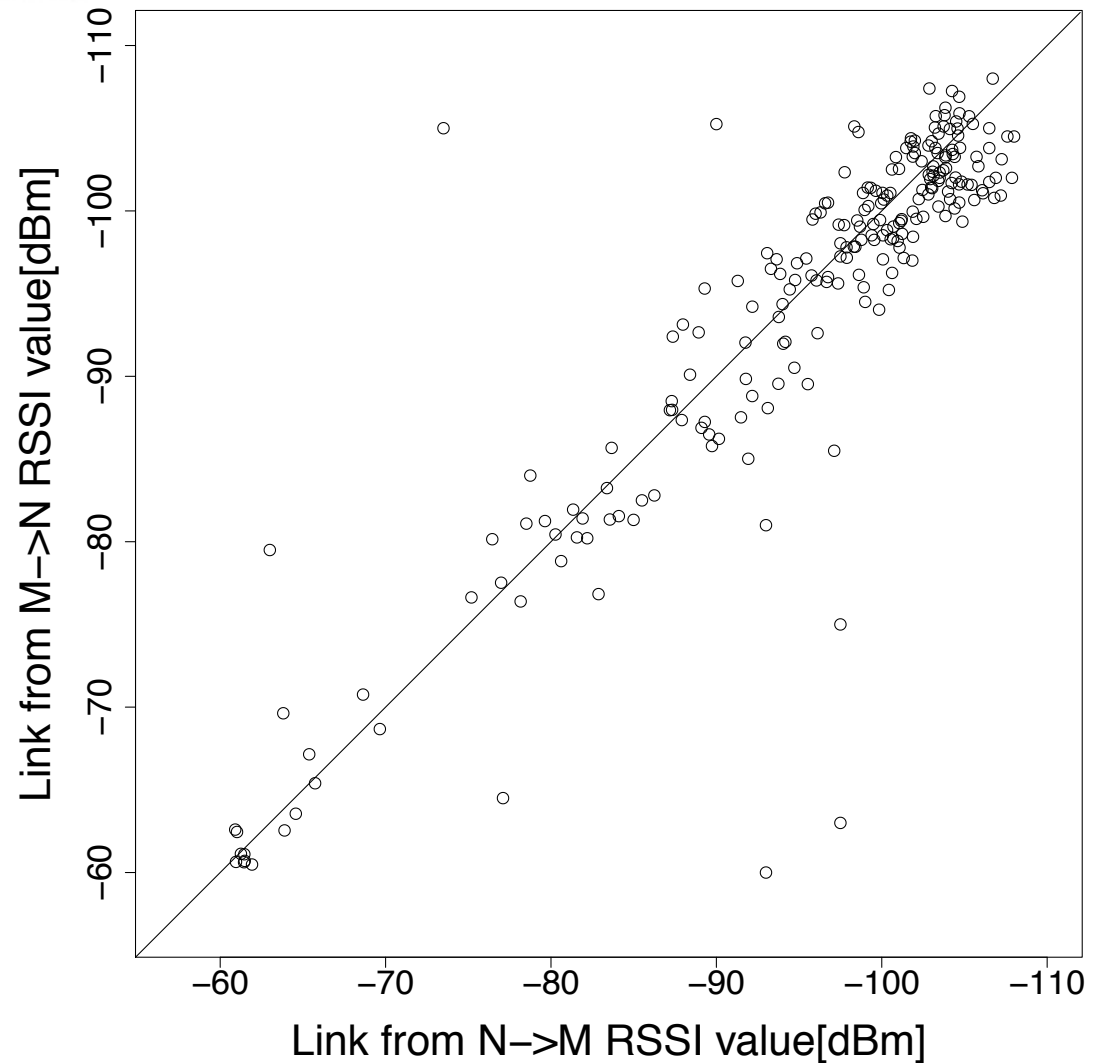
# Link properties

## Conclusion:

- 💧 Bidirectional links highly symmetrical

## In addition:

- 💧 RSSI value robust to environmental changes



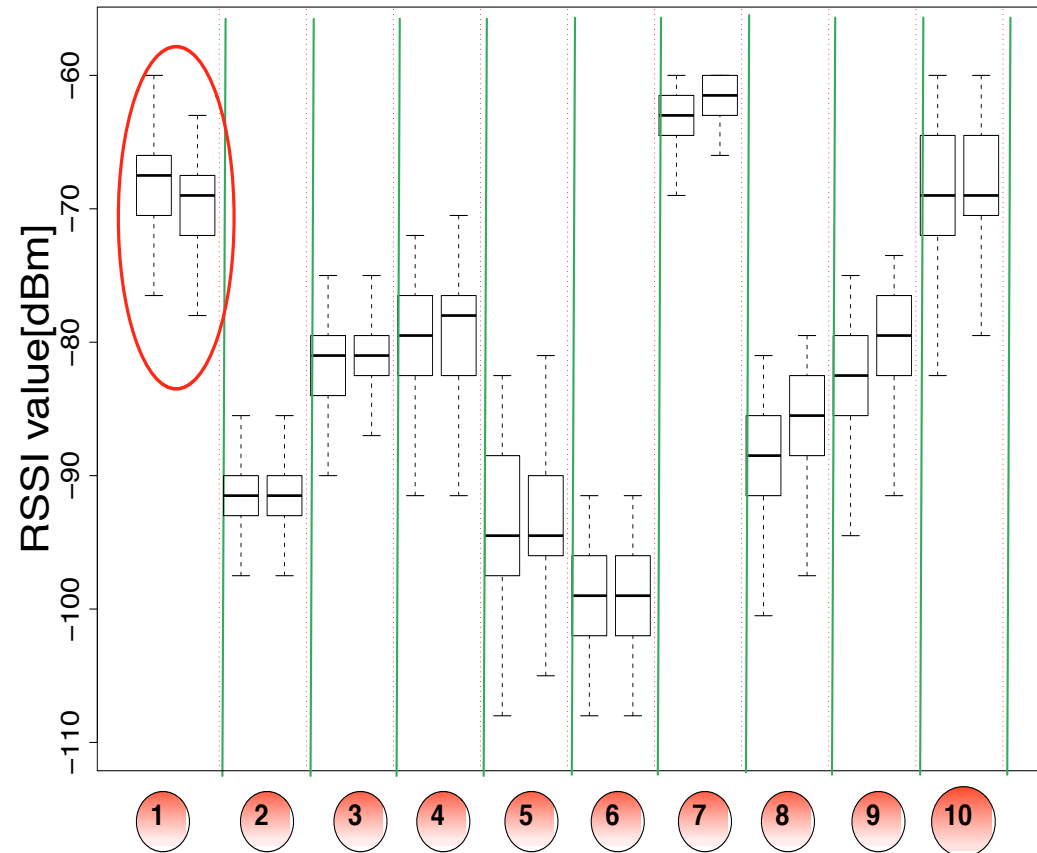
# Link properties

## Conclusion:

- Pairs of samples in bidirectional links follow the same distribution

## In addition:

- RSSI doesn't follow popular distributions **but** has similar bell shape

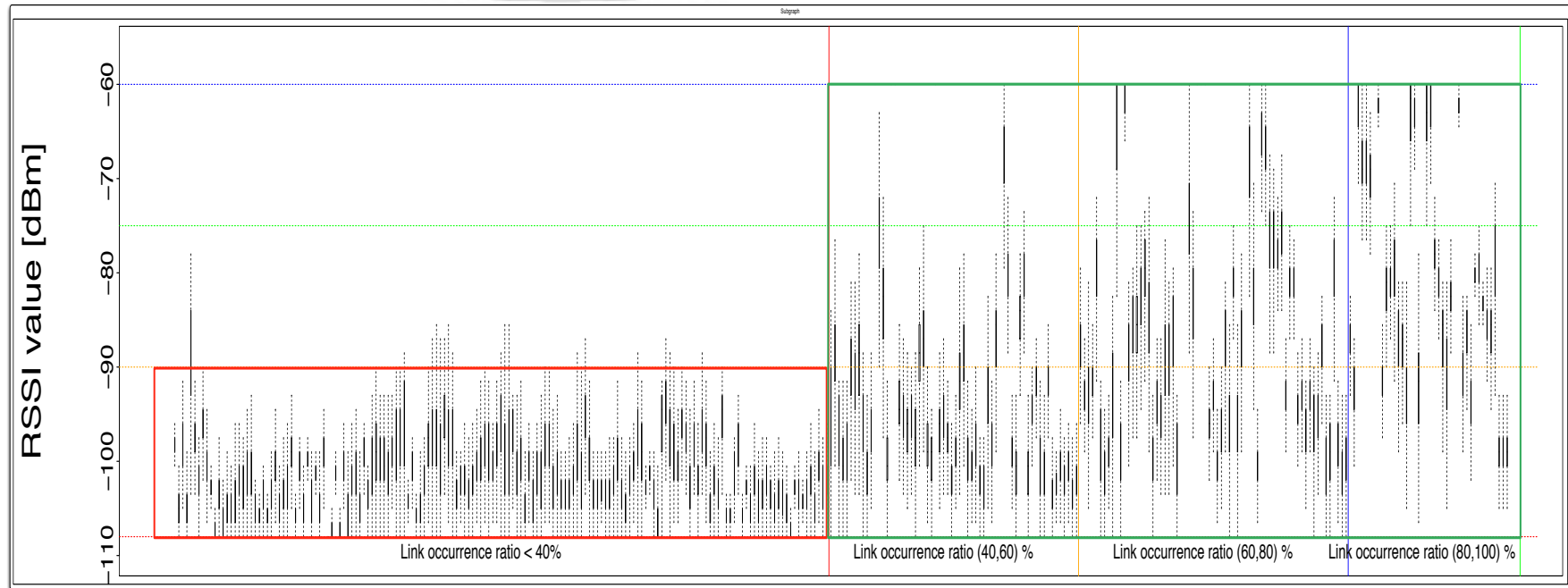


# Link occurrence ratio

- ◆ **def. Link occurrence ratio** - % of the cases where a node responded to *hello* discovery message qualifying a link with an RSSI value

**Example:** Hello rate = 1 packet/s, period = 10 s  
max = 10 detected = 4 => LOR = 40 %

# RSSI vs Link occurrence ratio



## Conclusion:

- ◆ A poor link obligatorily means low RSSI (1-40%) – red box
- ◆ Each category, different RSSI spreads – green box + red box => RSSI is not directly a good quality estimator
- ◆ Individual conclusions are not possible
- ◆ The largest RSSI values ~ the stable links.

# Network dynamics



# Neighborhood dynamics

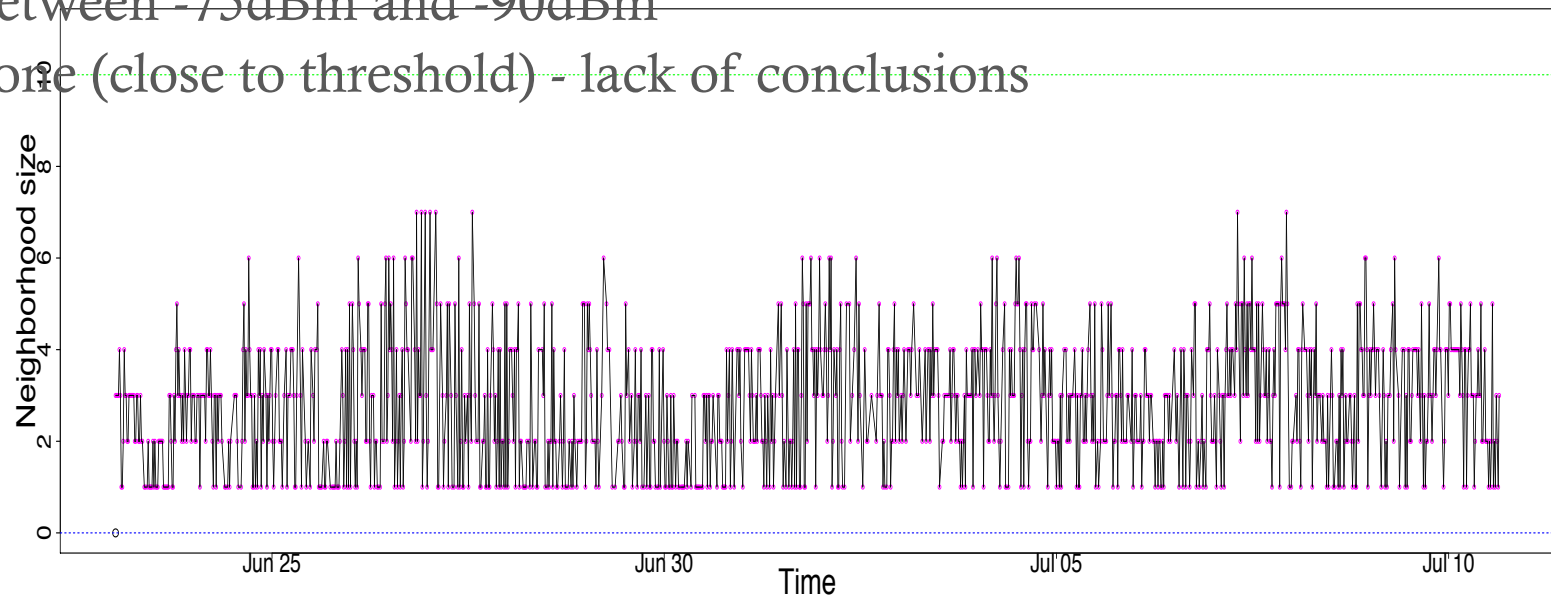
## Conclusions:

- High variations in neigh. tables => USE reactive approach
- Stable neighbors:  
high RSSI ( $> -75\text{dBm}$ ) and close distance ( $d < 0.2 \cdot R_{\text{max}}$ )

or

RSSI between  $-75\text{dBm}$  and  $-90\text{dBm}$

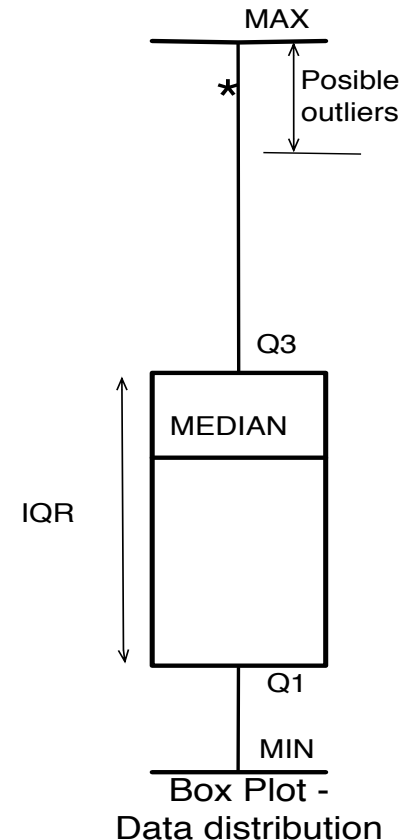
- Gray zone (close to threshold) - lack of conclusions



# Filtering outliers

- ◆ **Goal:** Detect and remove ambiguous and erroneous measures
- ◆ **Why?**
- ◆ What is the outlier?
- ◆ **How to detect them?**

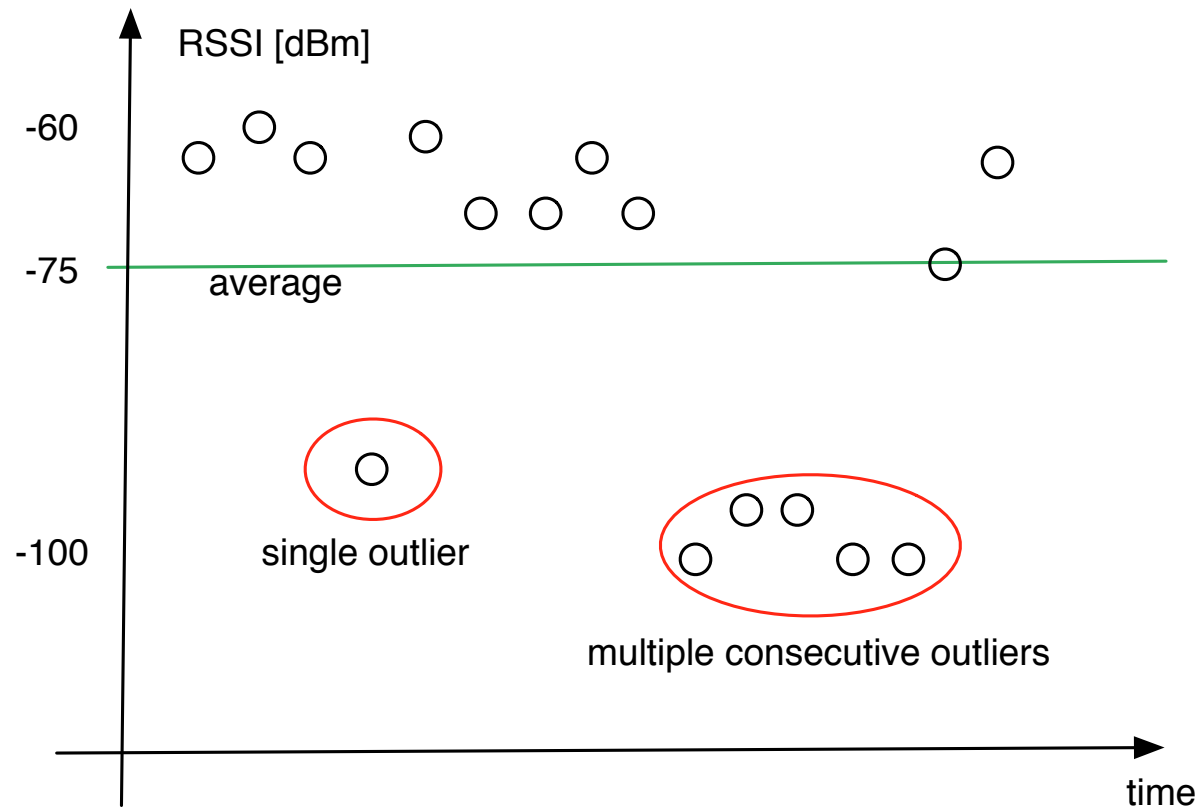
$$x < Q1 - 1.5 \cdot IQR \quad \vee \quad x > Q3 + 1.5 \cdot IQR$$





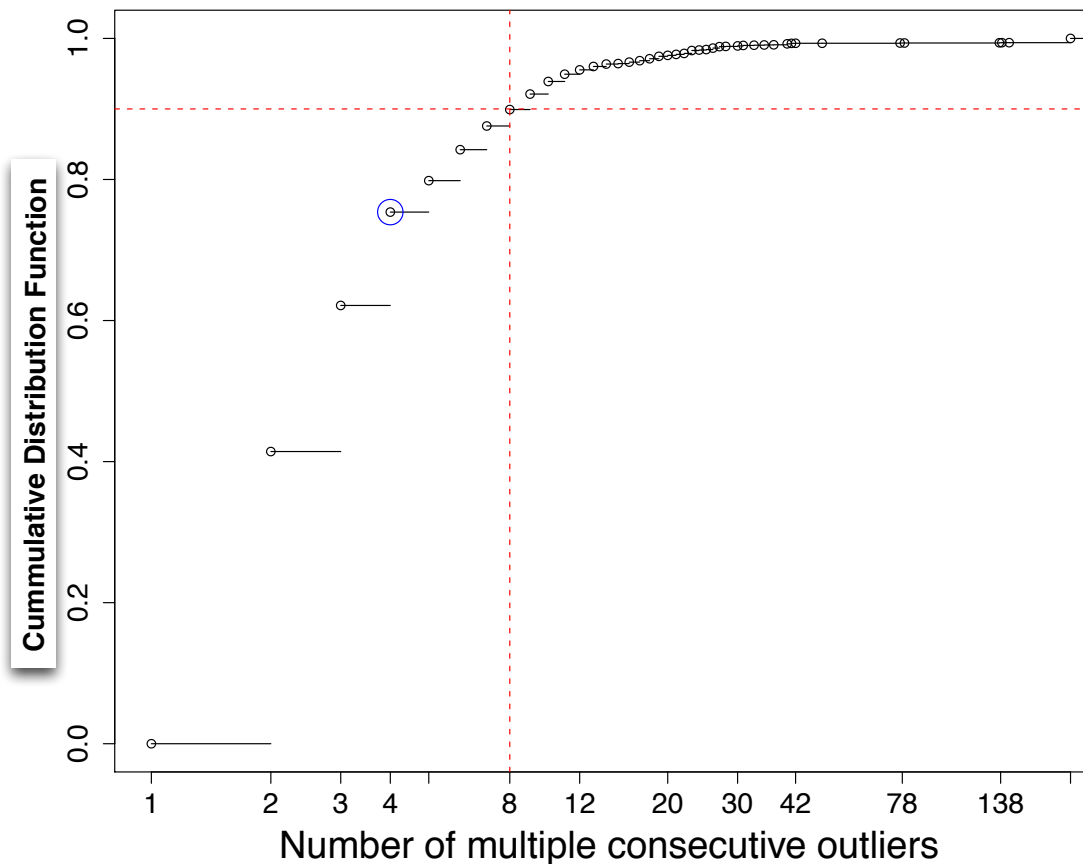
# Link dynamics

- ◆ **Single outlier:** transitory effect
- ◆ **Multiple consecutive outliers (MCO):** significant temporary change



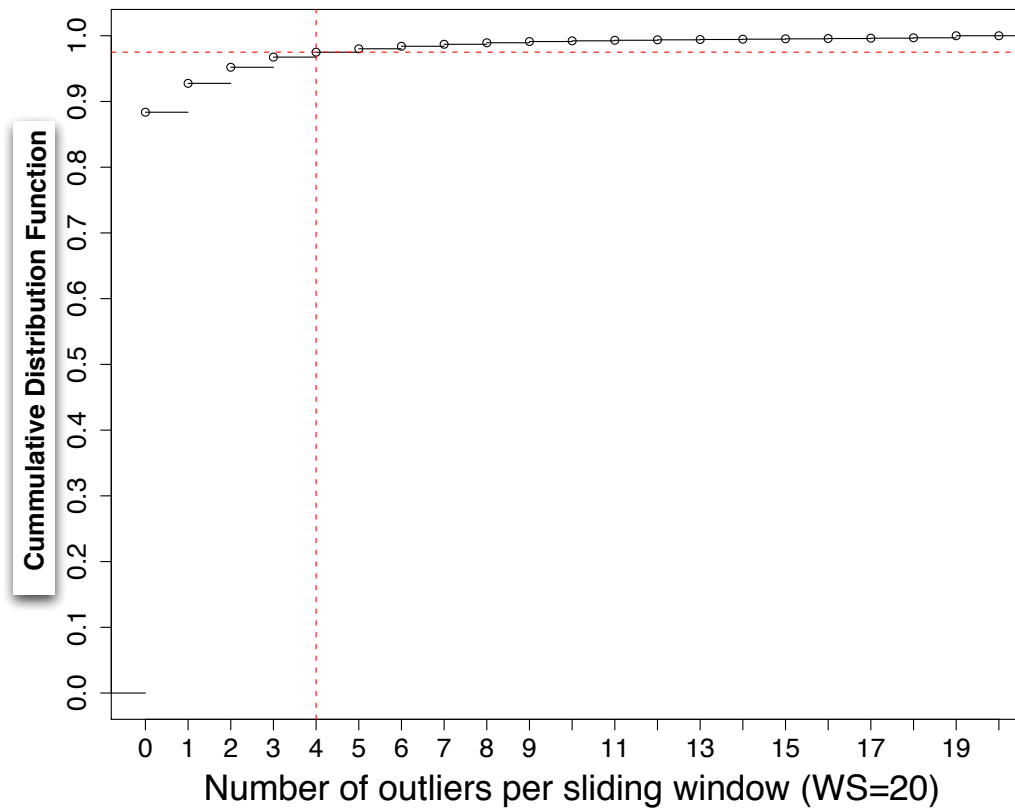
# Link dynamics – global view

- ◆ **Global knowledge:** Total duration of experiment
- ◆ In 90% of the cases – 8 or less MCO



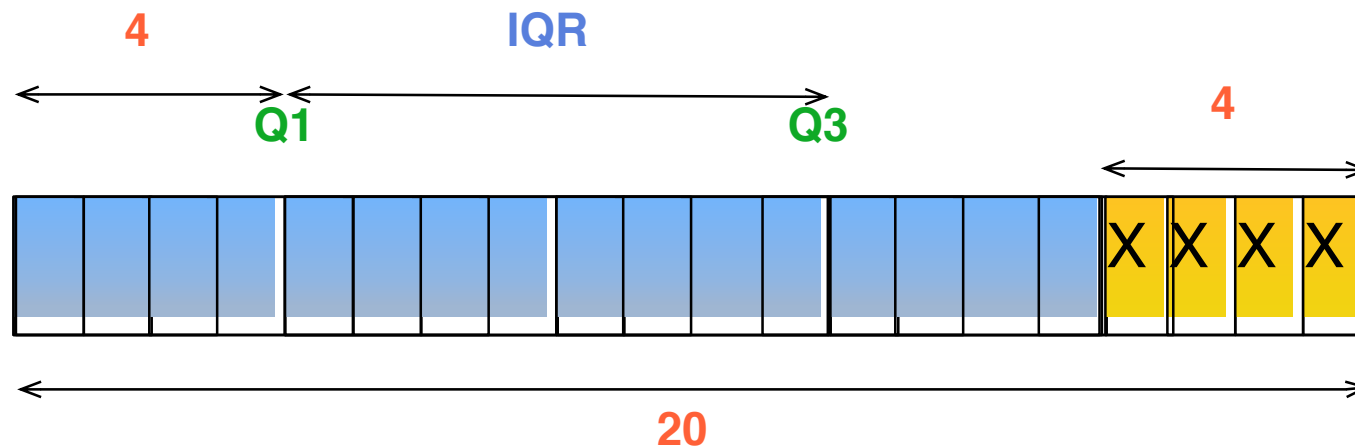
# Link dynamics – local view

- ◆ **Temporary knowledge:** sliding window of 20 samples
- ◆ In 97.5% of the cases – 4 or less MCO per window



# Practical impact

- ◆ Sliding window for filtering link quality
- ◆ Discard inaccurate measures but still reactive
- ◆ Applicable to any link quality metric



# Conclusion

## **Conclusion:**

- ◆ Thorough analysis - insight in WSN environment properties
- ◆ Practical method for detecting and discarding outliers
- ◆ Insufficient details can seriously limit the analysis reach

## **Recommendations for a testbed:**

- ◆ Global network synchronization
- ◆ Include PER in discovery and data packets
- ◆ Include the RSSI in both directions

## **Future work:**

- ◆ Use results in RPL
- ◆ Analyze bursty link behavior

# Questions?

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