

# QoF: Towards Comprehensive Path Quality Measurement for Wireless Sensor Networks

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# Outline

- Background
- Motivation
- QoF Design
- Evaluation
- Conclusion

# Motivation

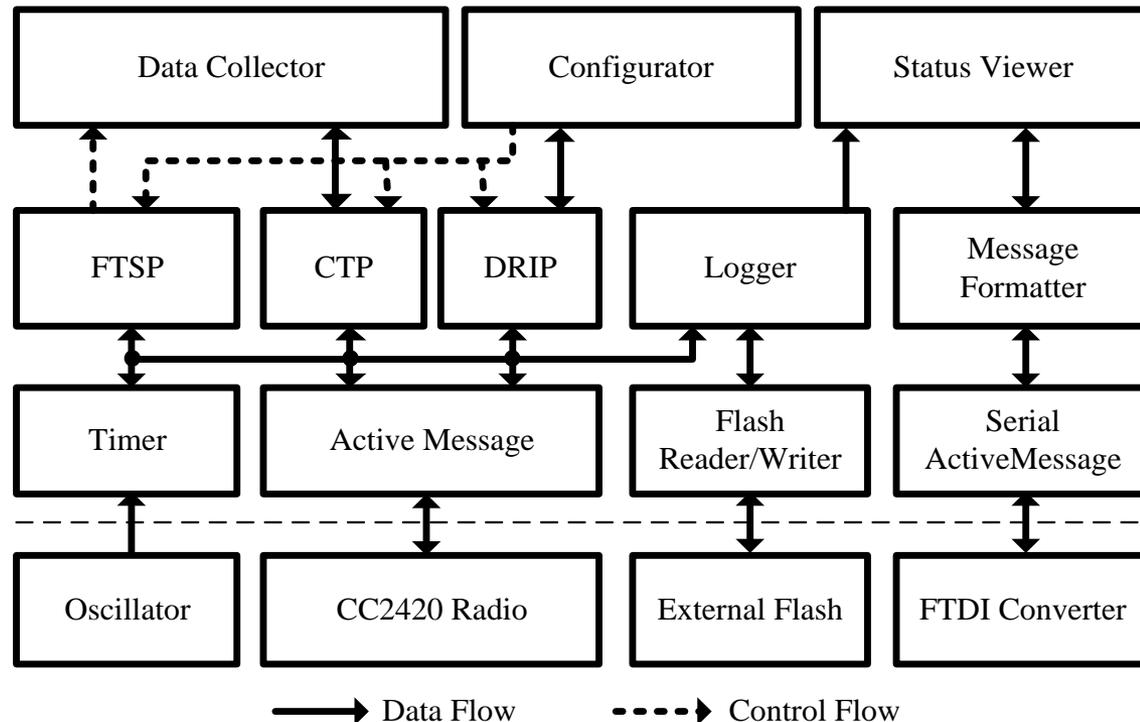
- GreenOrbs
  - A large-scale long-term wireless sensor network system in the wild
  - support a variety of forestry applications, such as canopy closure estimates [1], fire risk evaluation, microclimate monitoring, and carbon dioxide measurement.



[1] Lufeng Mo, Yuan He and etc., Canopy Closure Estimates with GreenOrbs: Sustainable Sensing in the Forest. ACM SenSys 2009

# Software Architecture

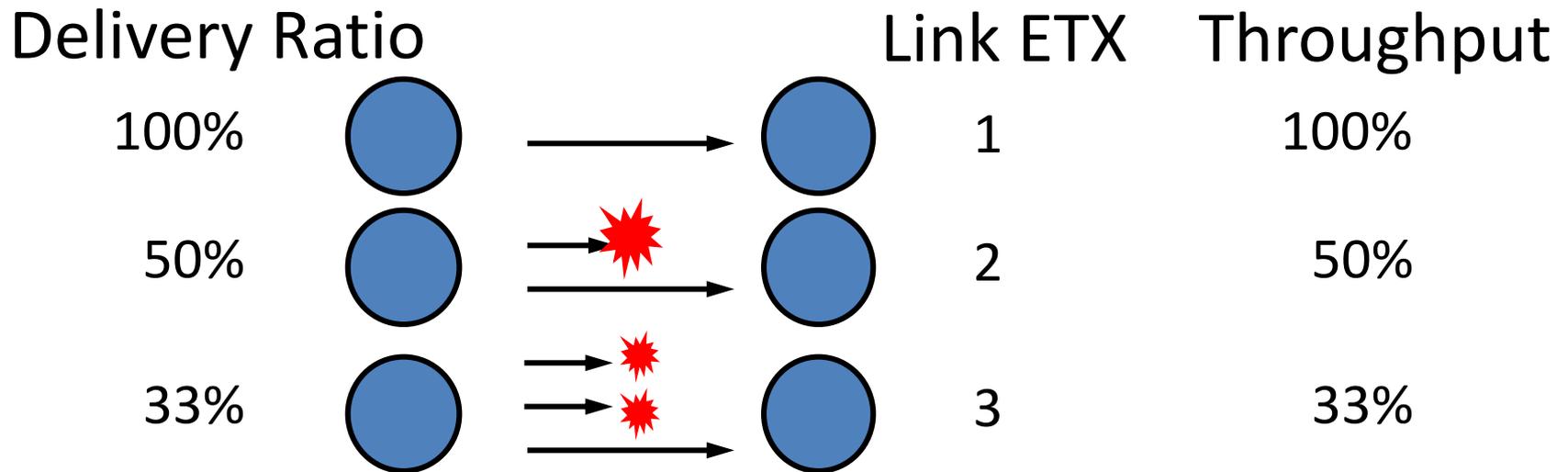
- Software based on TinyOS 2.1.1
  - Low Power Listening
  - Data collection: CTP
  - Parameter dissemination: DRIP



# Collection Tree Protocol:CTP

- Minimize total transmissions per packet (ETX[1], 'Expected Transmission Count')

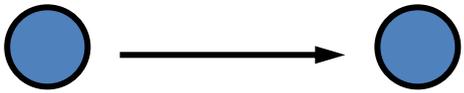
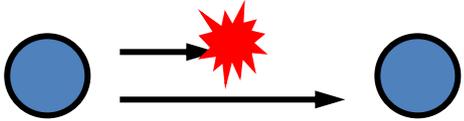
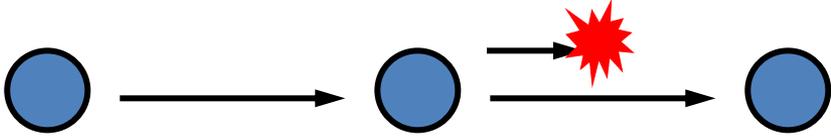
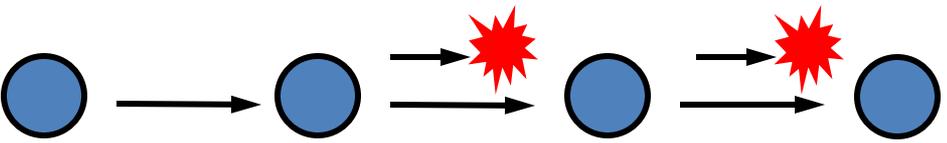
Link throughput  $\approx 1 / \text{Link ETX}$



[1] Douglas S. J. De Couto, Daniel Aguayo and etc., A HighThroughput Path Metric for MultiHop Wireless Routing. MobiCom 03

# Link and Path ETX

Path ETX = Sum of link ETXs

	<u>Route ETX</u>	<u>Throughput</u>
	1	100%
	2	50%
	2	50%
	3	33%
	5	20%

# ETX Merits

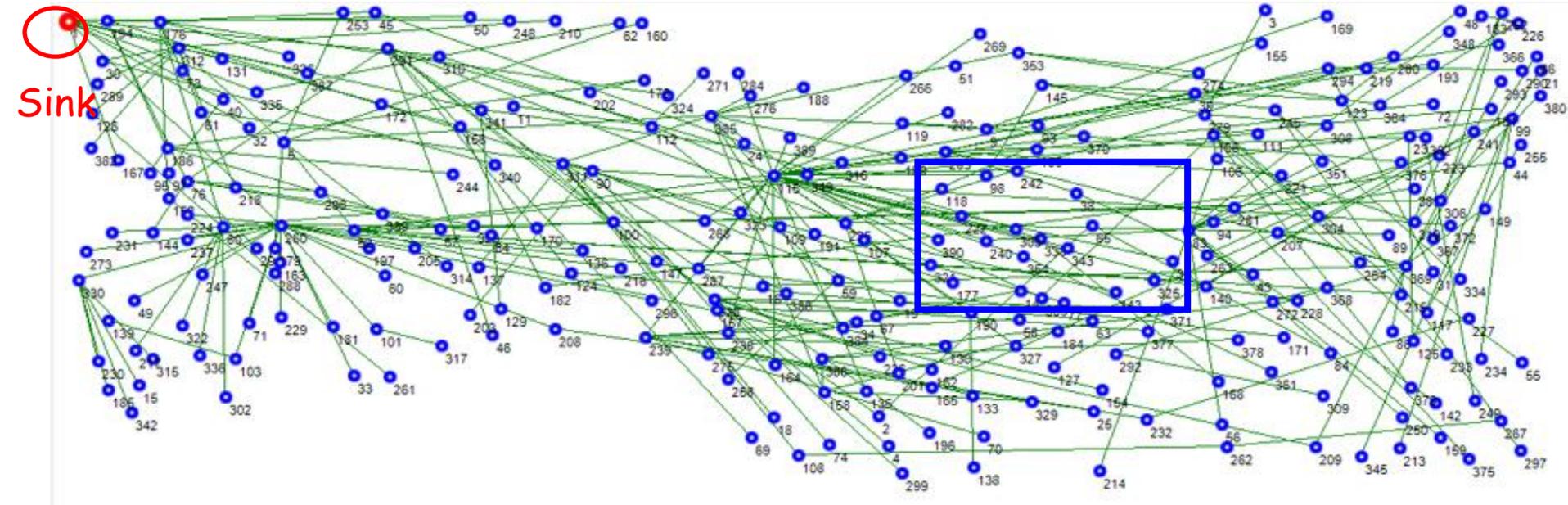
- ETX predicts throughput for short routes (prefer short routes)
- ETX quantifies packet losses
- ETX quantifies asymmetry

# GreenOrbs Topology



- 330-node network topology
- The deployment area is about 40,000 m<sup>2</sup>.

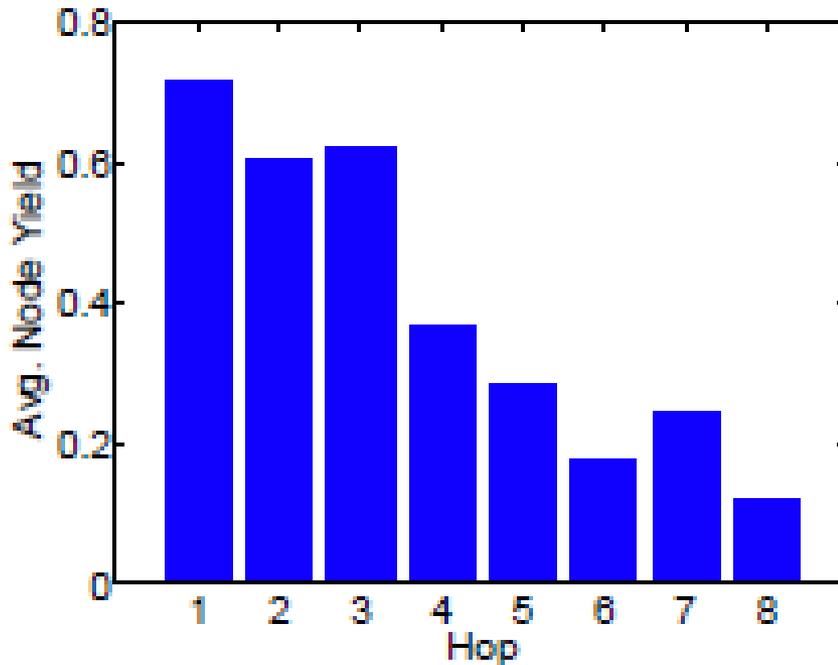
# GreenOrbs Topology



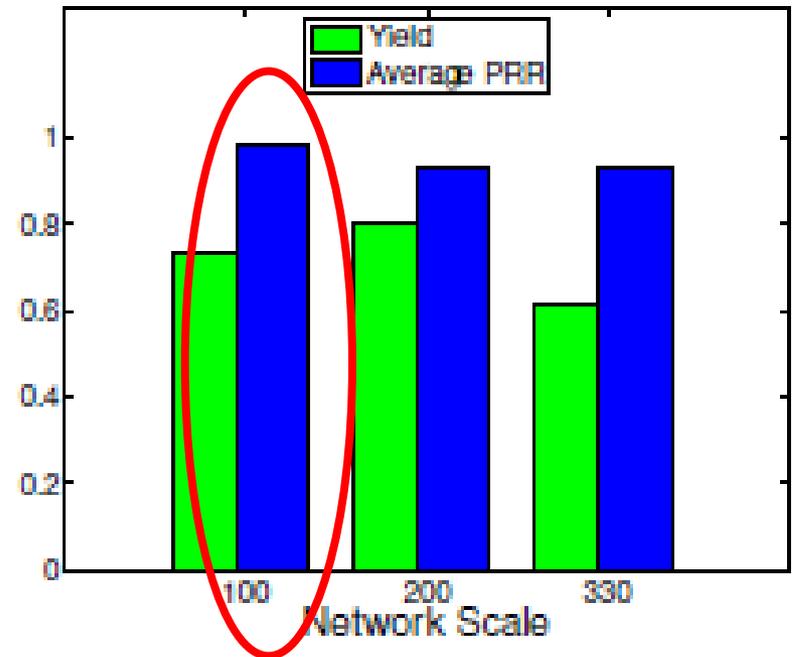
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# Performance in Early Deployment

## Node Yield



## Network Yield

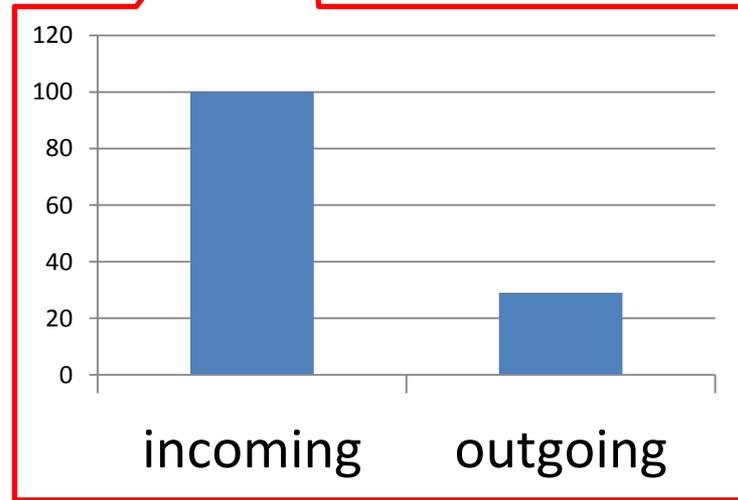
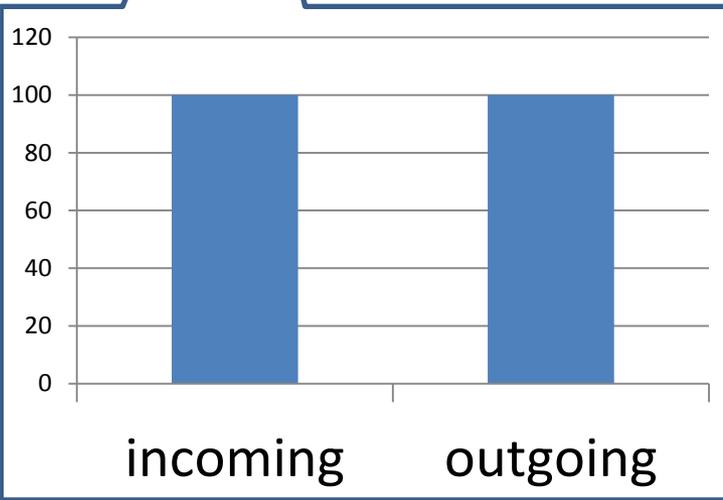
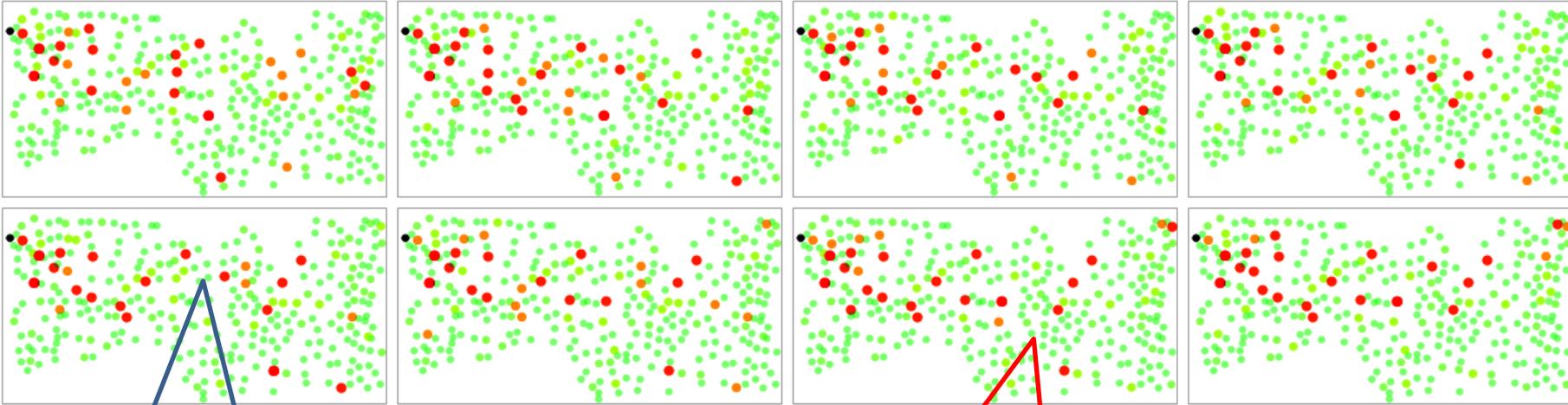


$$yield = \frac{\# \text{ of data pkts received at the sink during } w}{\# \text{ of data pkts sent by all nodes during } w}$$

# Why unexpected performance?

# Observation 1

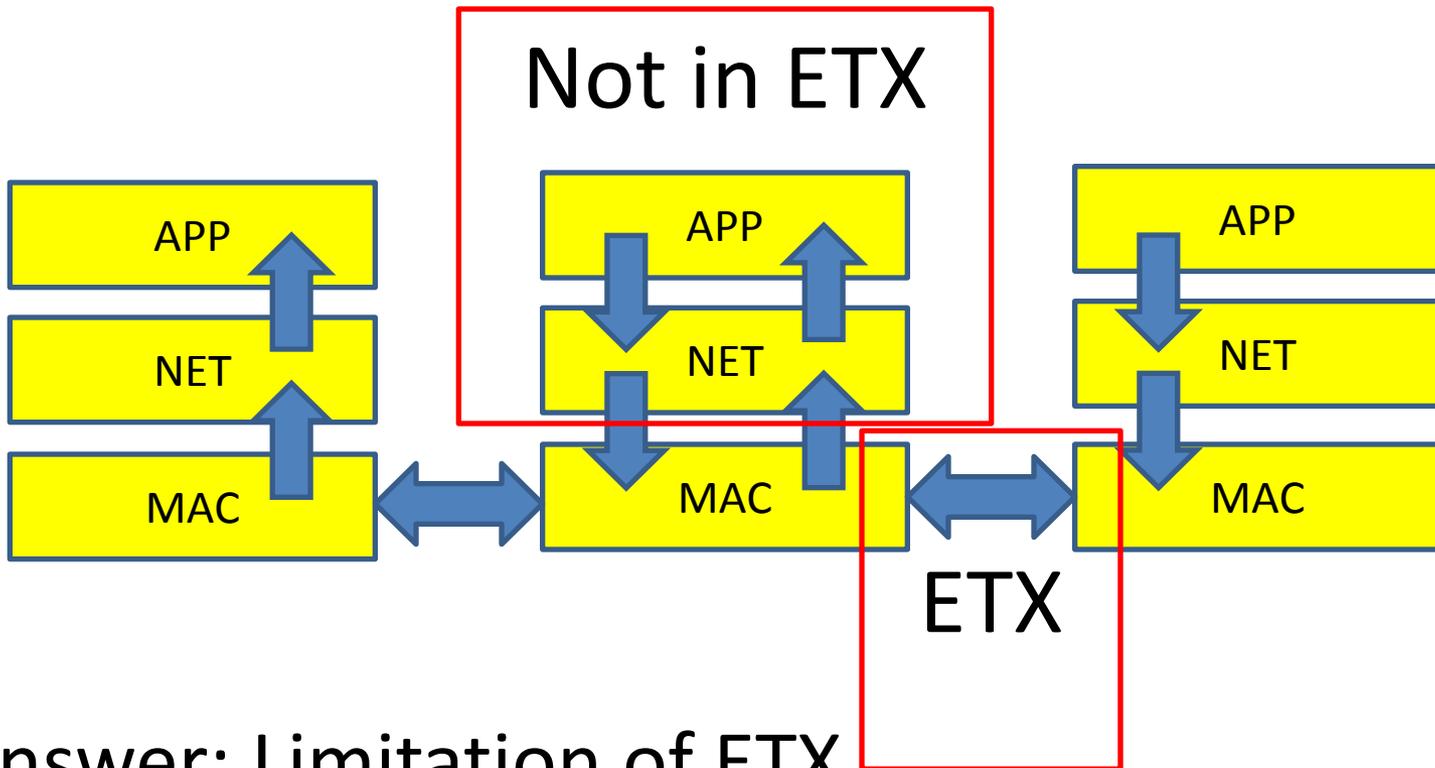
- Traffic distribution





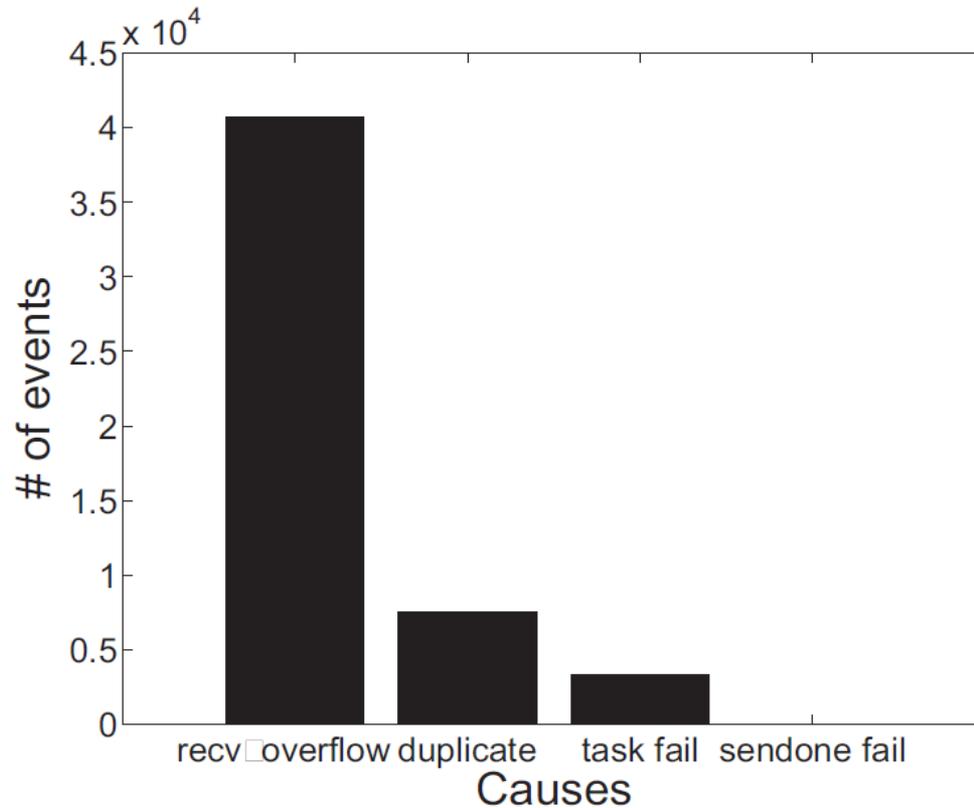
# Observation 1

- Why those nodes are still used in CTP?



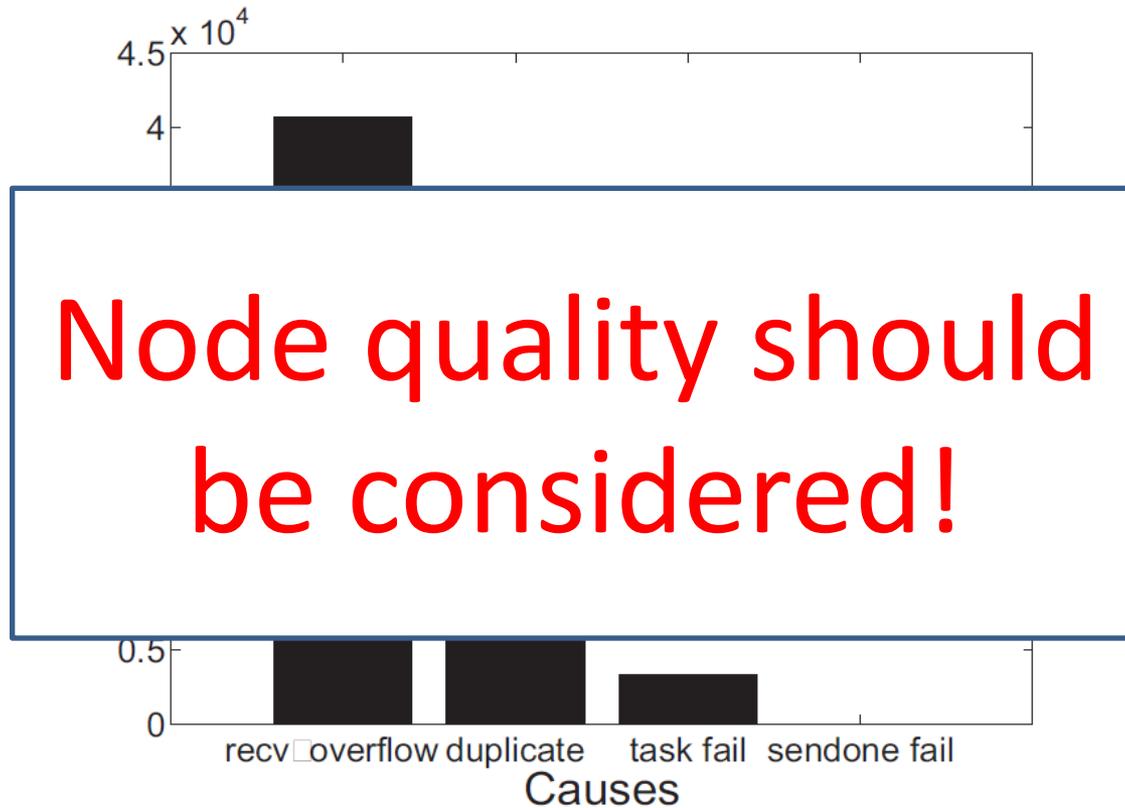
- Answer: Limitation of ETX

# Observation 1



**Causes of packet loss on sensor nodes**

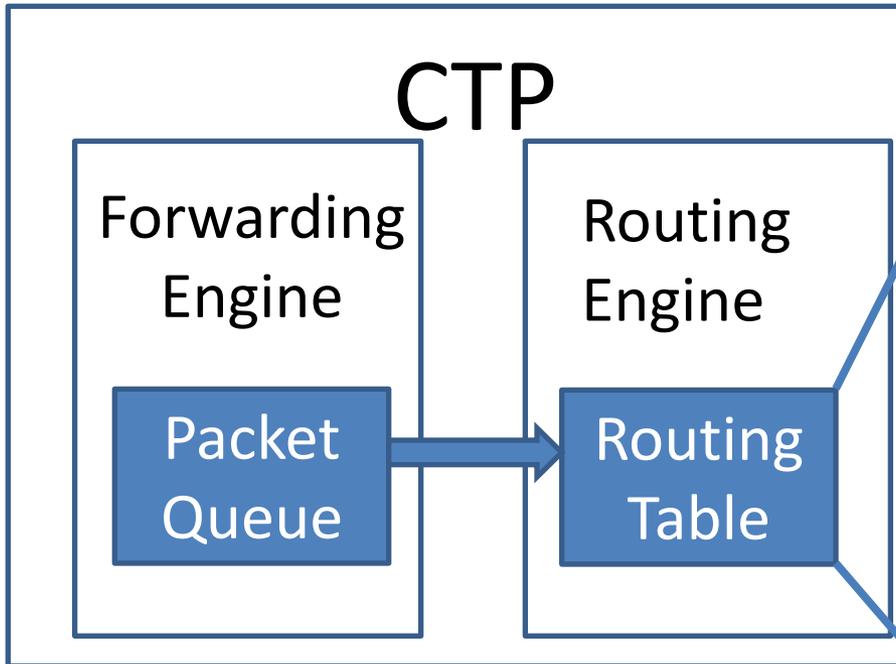
# Observation 1



**Causes of packet loss on sensor nodes**

# Observation 2

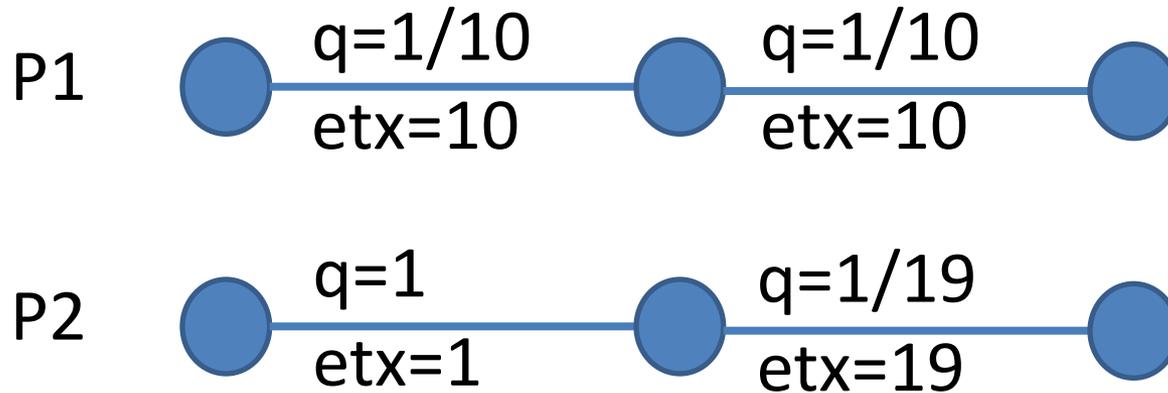
- CTP mechanism



Neighbor ID	ETX
1	100
2	50
3	20
4	20
...	...

# Observation 2

**1900** packets sent from the source



**P1: 19** packets received in expectation

**P2: 100** packets received in expectation

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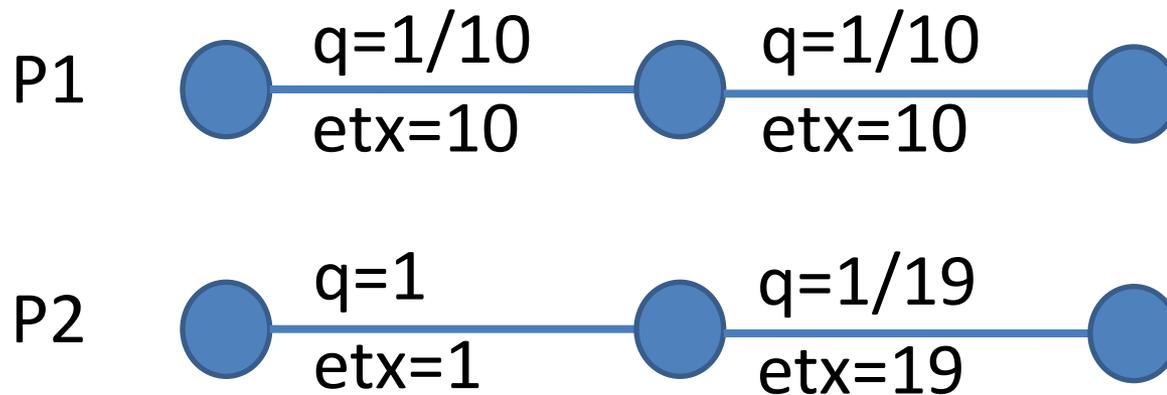
**ETX cannot  
completely quantify  
the quality**

**P1: 19** packets received in expectation

**P2: 100** packets received in expectation

# Observation 3

- Impact of retransmission threshold
- We measure the Packet Reception Ratio (PRR)



- $r=1$ :  $PRR(P1) = 1/100$ ,  $PRR(P2)=1/19$
- $r=30$ :  $PRR(P1) = PRR(P2) = 1$

# Observation 3

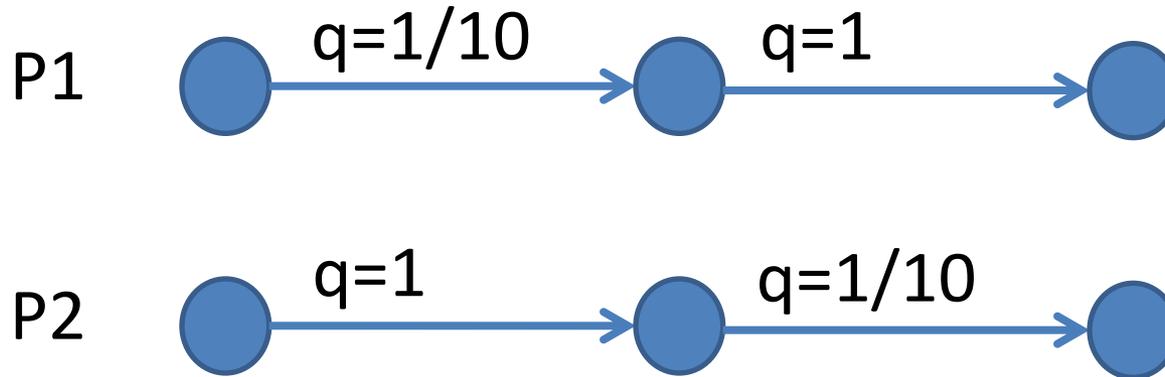
- Impact of retransmission threshold
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**Retrans threshold  
matters**

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# Observation 4

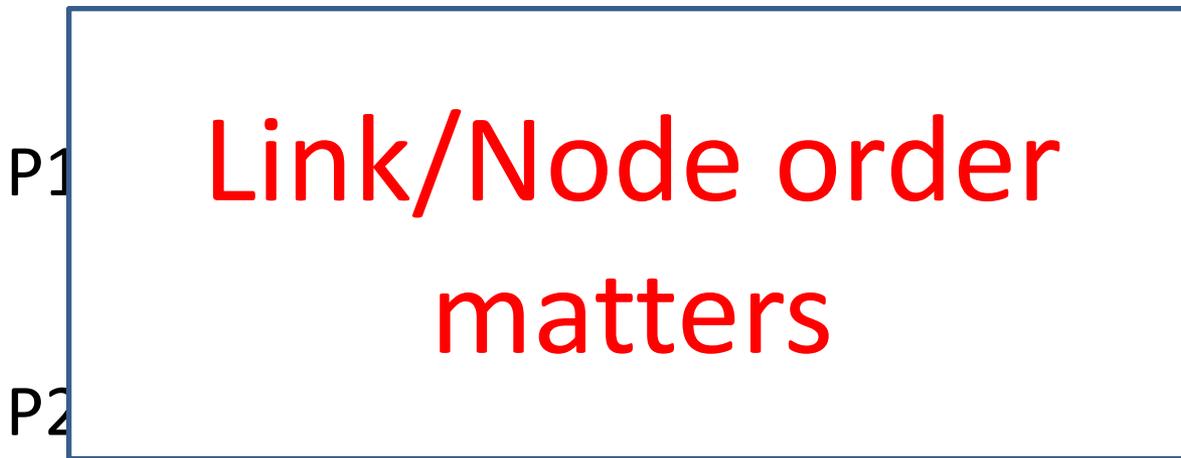
- Link and node order?



- Cost more if a packet lost near the sink after a long journey.

# Observation 4

- Link and node order?

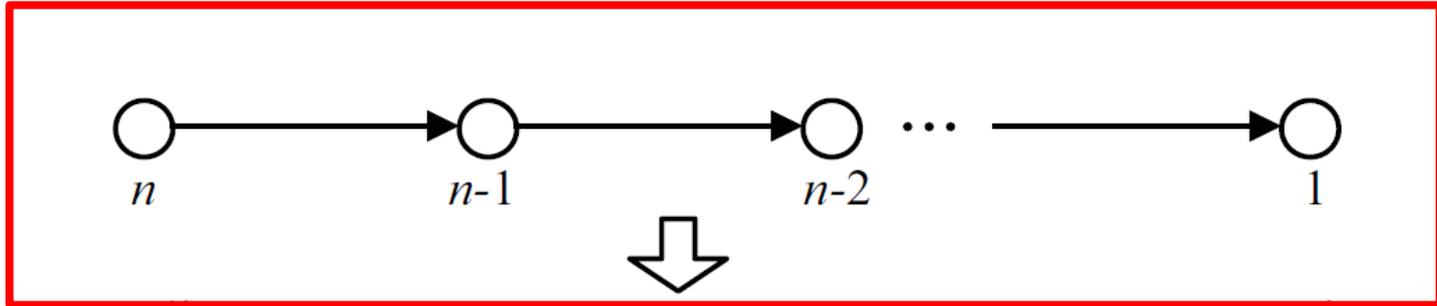


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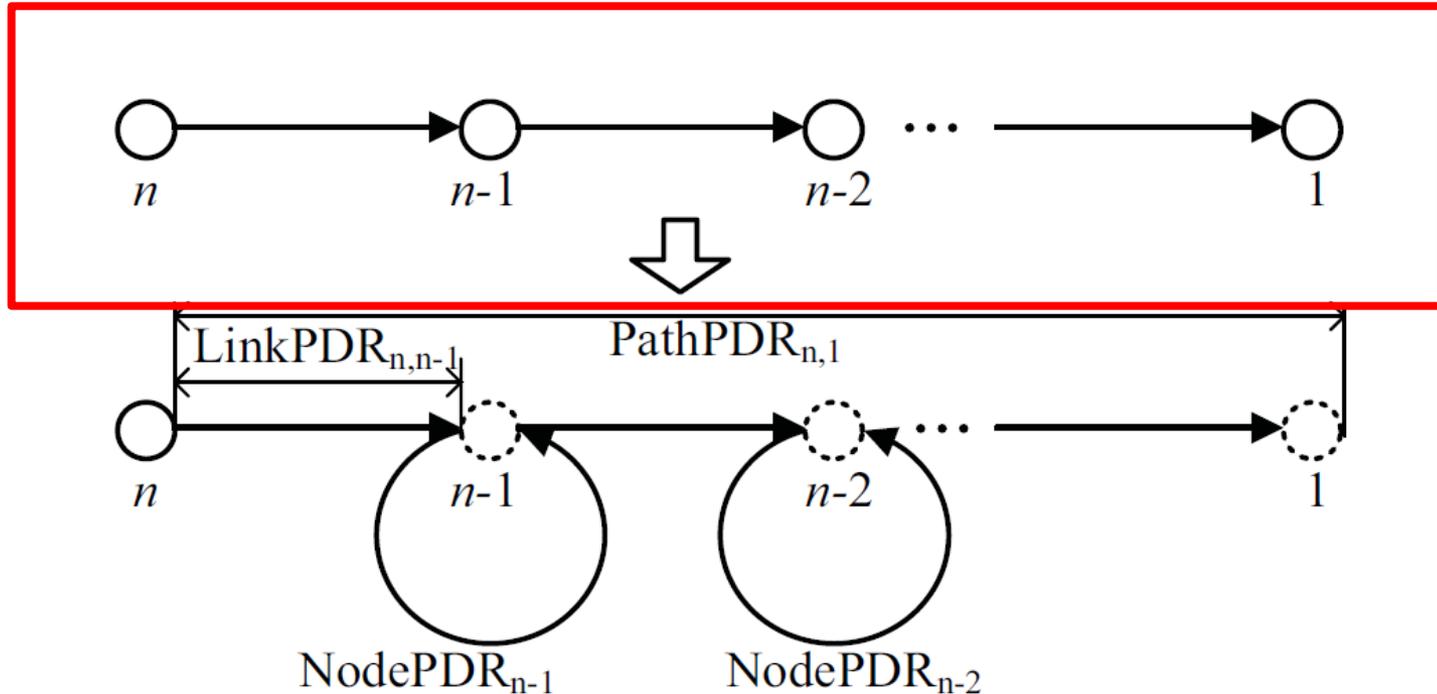
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# QoF Model



- Path = link + link +...
- Path = link + node + link+...

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# Measuring link PDR and ETC

- Packet Delivery Ratio (PDR)
  - For a node,  $PDR = outCtr / inCtr$
  - For a link,  $PDR = 1 - (1 - q)^{r+1}$ ,  $q$  is link quality,  $r$  is retransmission limit
- Expected Transmissions (ETC)
  - The number of expected transmissions for any packet, under the retransmission limit of  $r$

$$ETC = \sum_{k=1}^r kq(1-q)^{k-1} + r(1-q)^r = \frac{1 - (1-q)^{r+1}}{q}$$

# QoF: Quality of Forwarding

- $QoF^{-1}$ : the expected transmission count for a **successful end-to-end** transmission on a path.

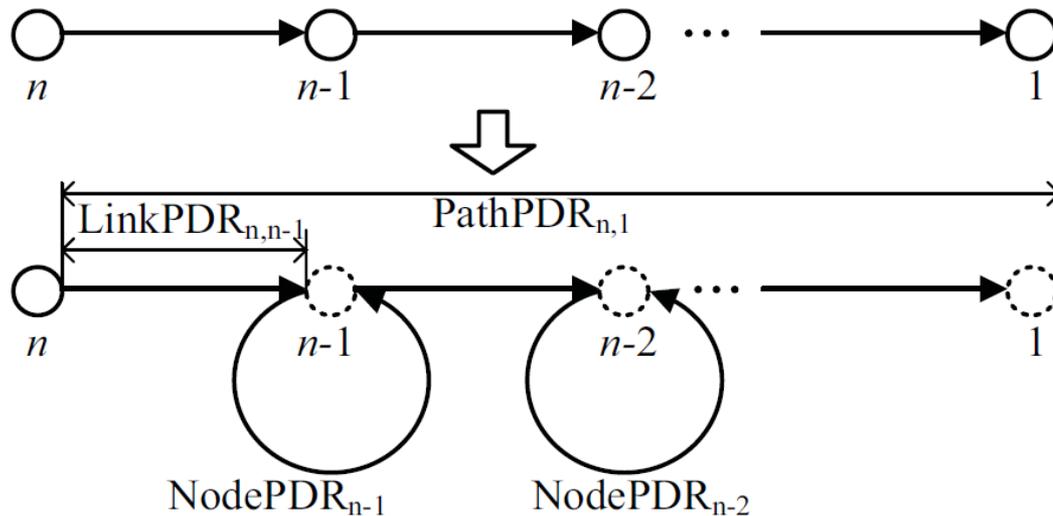
$$QoF = \frac{x \times PDR}{x \times ETC} = \frac{PDR}{ETC}$$

QoF: the expected successful end-to-end transmission for a transmission count.

QoF is in the range of [0 1].

# QoF: Quality of Forwarding

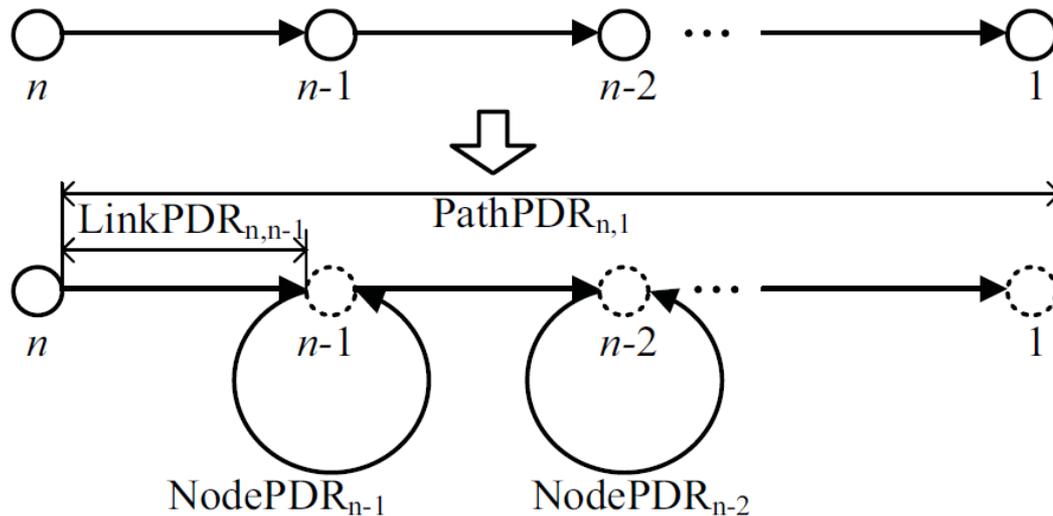
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$$PDR_{n \rightarrow 1} = PDR_{n,n-1} \times PDR_{n-1,1} \times PDR_1$$

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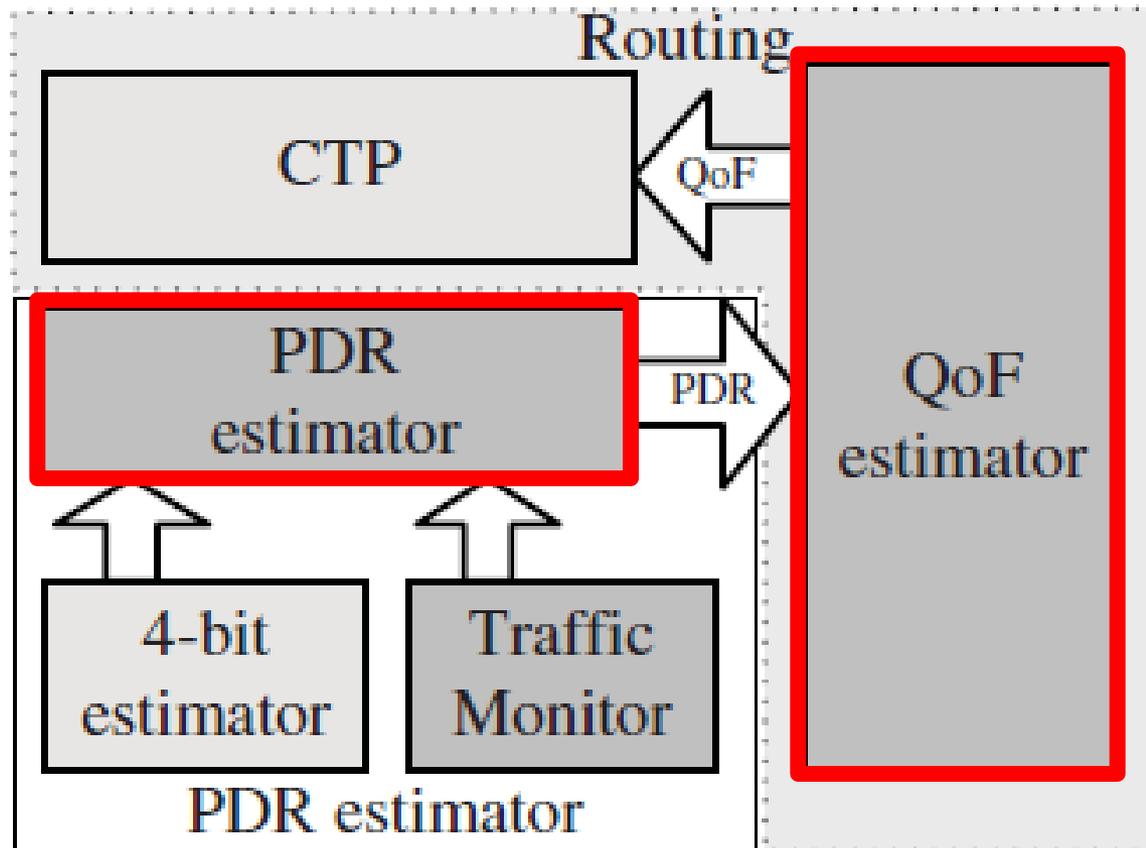


$$PDR_{n \rightarrow 1} = PDR_{n,n-1} \times PDR_{n-1,1} \times PDR_1$$

$$QoF_n = \frac{PDR_{n \rightarrow 1}}{ETC_{n,n-1} + \frac{PDR_{n \rightarrow 1}}{QoF_{n-1}}}$$

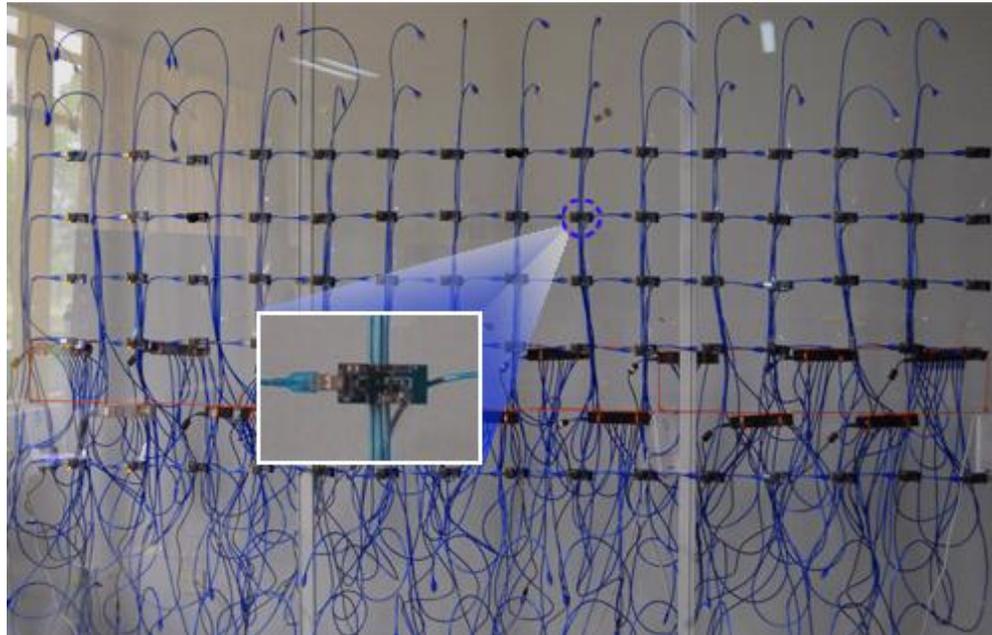
# Implementation

- Integrating QoF with CTP in TinyOS



# Evaluation

- GreenOrbs test-bed
  - Experiments with 50~150 nodes

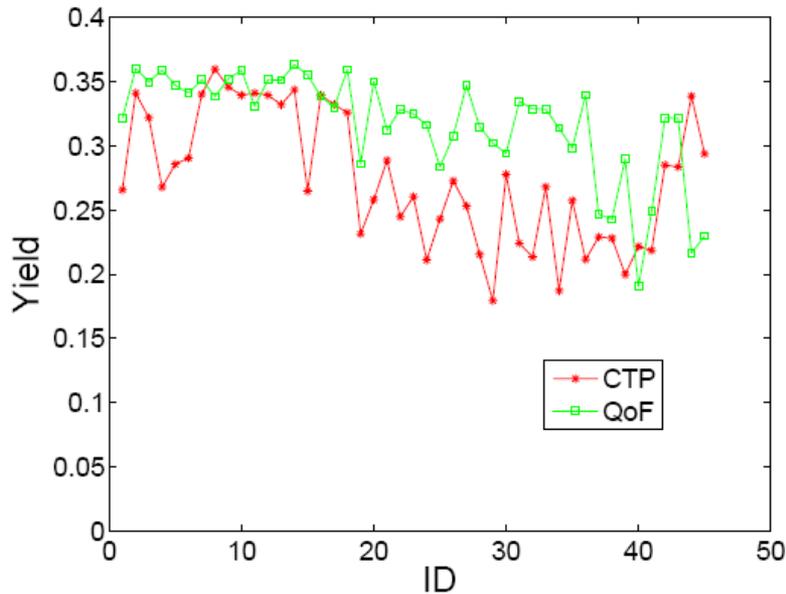


# Evaluation Settings

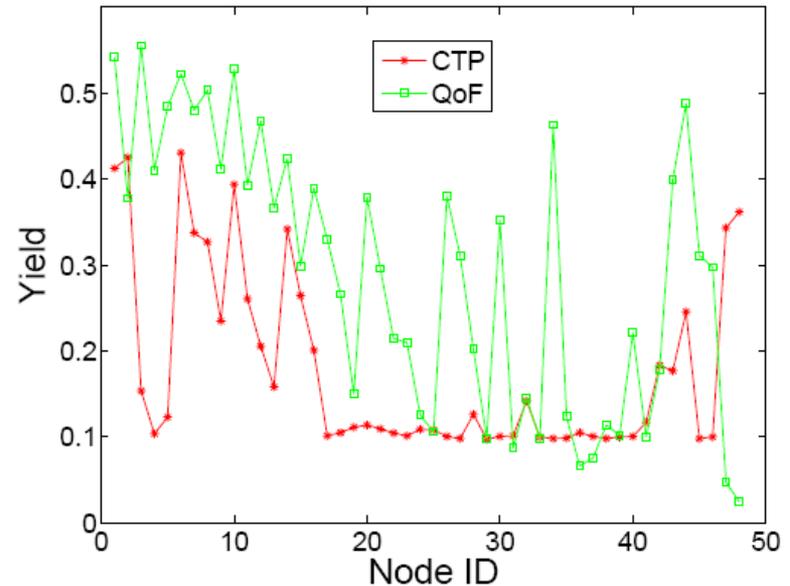
- Two settings:
    - Case I: streaming application case.  
retrans threshold = 1,  
transmission frequency = 3Hz.
    - Case II: real-world deployment case.  
retrans threshold = 30,  
transmission frequency = 3Hz,
- We use an old version program of GreenOrbs, which has a bug resulting in some “problematic” nodes.

# Evaluation

- Data yield: the percentage of successfully received packets at the sink



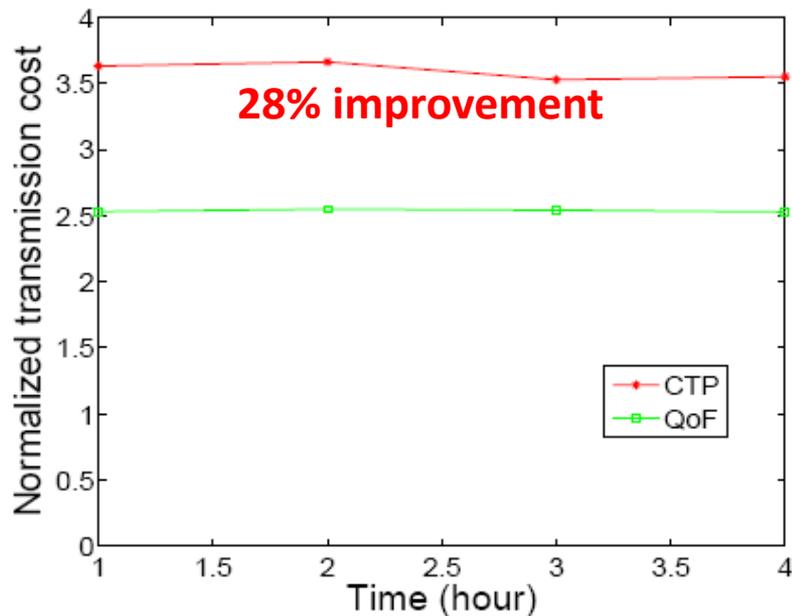
**Case I: High traffic pressure and low retransmission threshold ( $r=1$ )**



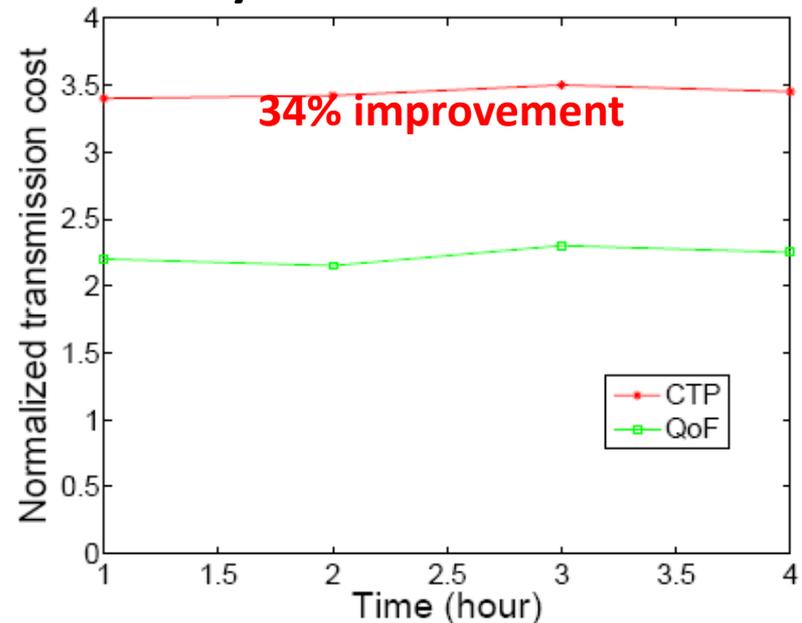
**Case II: When faulty nodes are present &  $r=30$**

# Evaluation (cont.)

- Average number of transmissions for a successful end-to-end delivery



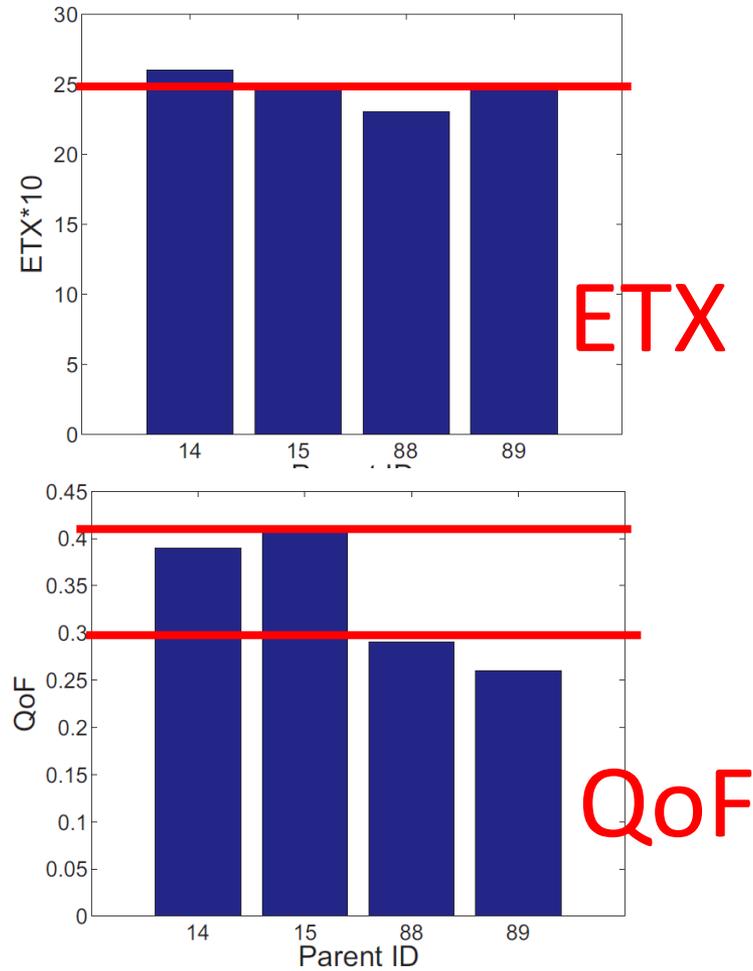
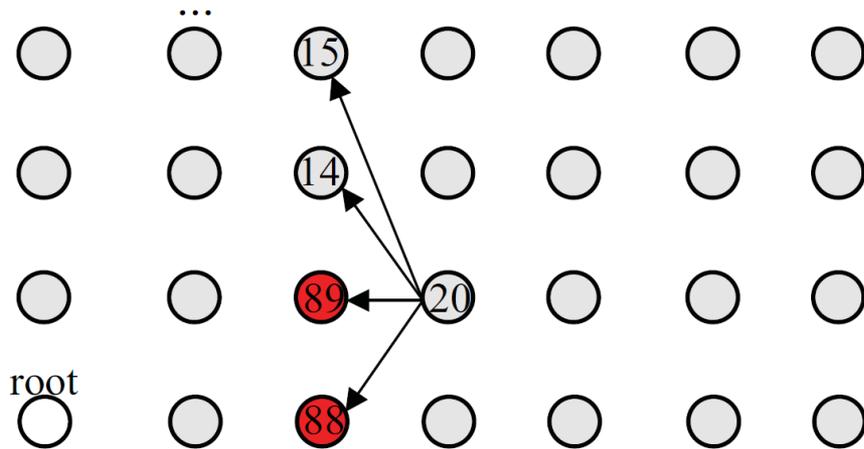
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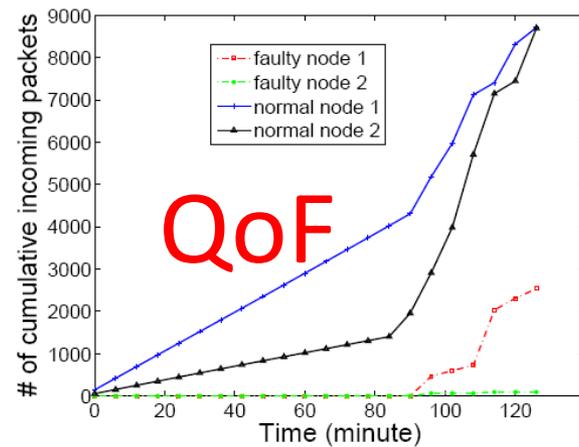
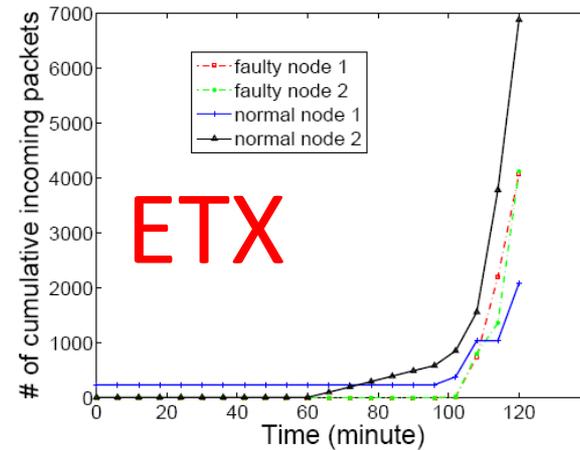
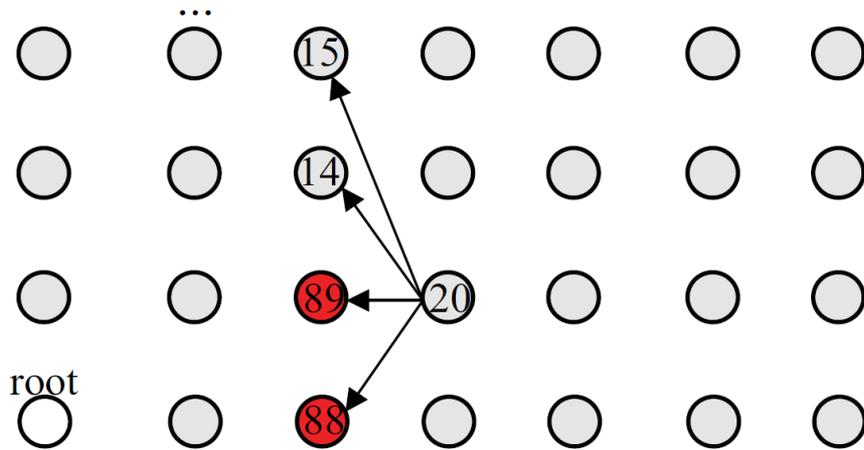
# Evaluation

- Routing behavior of CTP(+ETX) vs. QoF



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- Routing behavior of CTP(+ETX) vs. QoF



# Conclusion

- We measure practical performance of ETX in a large scale sensor networks in the wild.
- We find the limitation of state-of-the-art metric.
- We propose the QoF design that comprehensively measure the path quality.

# Thanks

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