# Large Scale Distributed Systems

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#### Reliable event dissemination

Reliably send to multiple destinations (group)

- Informally: all destinations deliver all messages
- Senders and receivers fail: all correct destinations deliver the same messages
  - average % of destinations
  - % of messages to all destinations

Agreement / Atomicity

#### Performance metrics

#### Bandwidth

Payload and control messages

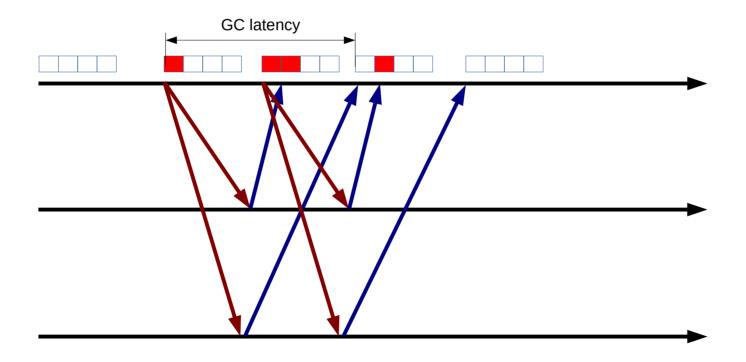
System total and maximum in one node/link

#### **Latency**

- Time and network hops to delivery
- Average vs last delivery

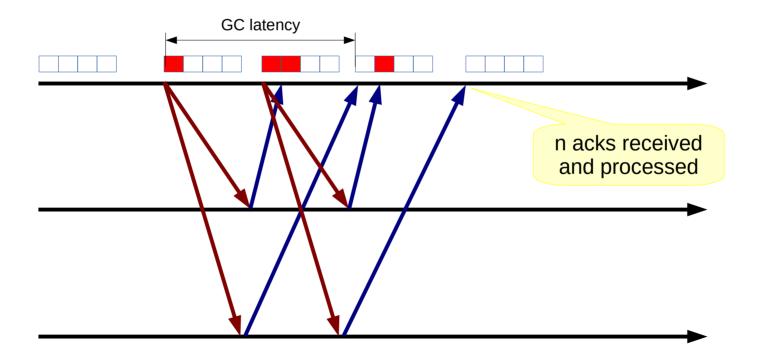
# General approach

Buffer and retransmit until acknowledged



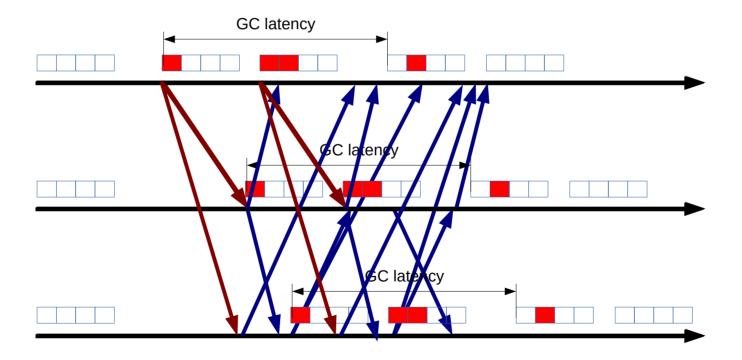
### Acknowledgments

 Not scalable to large number of destinations due to "ack implosion":



# Agreement

 Acks need to be sent to all destinations resulting in "O(n²) ack implosion":

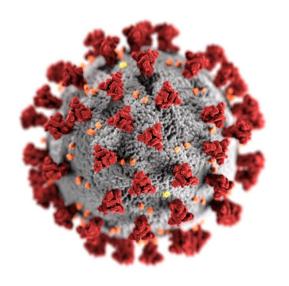


#### Trees

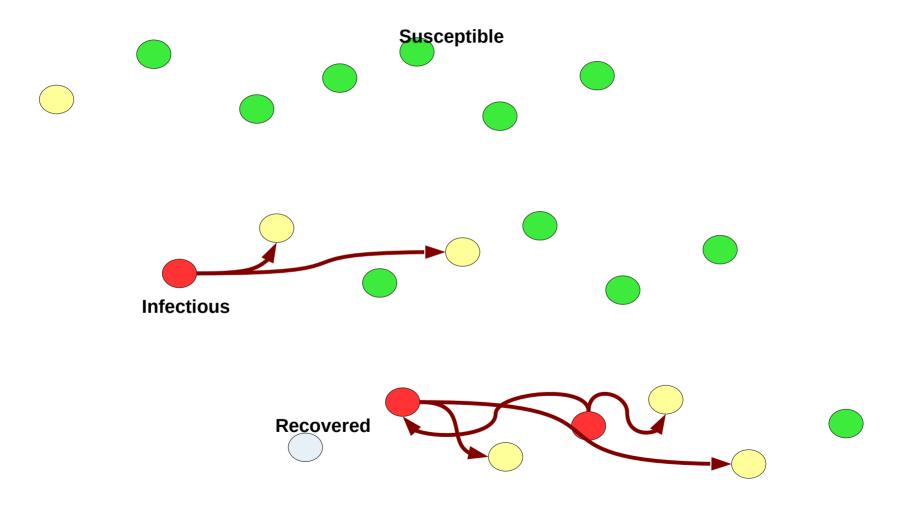
- Build a spanning tree over the destination nodes
  - Maintenance overhead
  - Brittle, as a single node/link failure leads to partitioning
- Use the tree for payload and feedback (acknowledgments)
  - Global vs local acknowledgment
- Trades latency for bandwidth!
  - More latency means more memory committed in buffers

# **Epidemics**

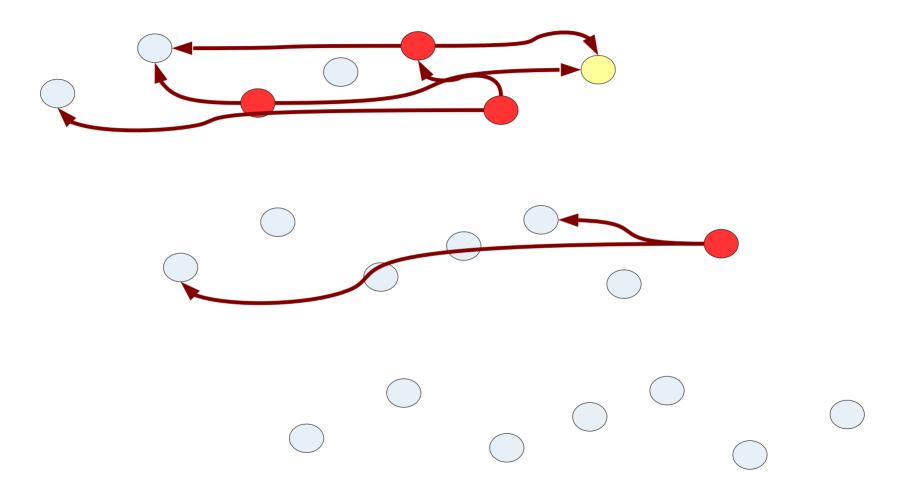
- Epidemic spread in a population
- SIR model:
  - Susceptible
  - Infectious
  - Recovered



# **Epidemics**



# **Epidemics**



# Analysis

- Probability of atomic infection p:
  - f = log(n) + c
  - p = exp(-exp(-c))
- Duration of epidemic when infecting the entire population order of log(n)

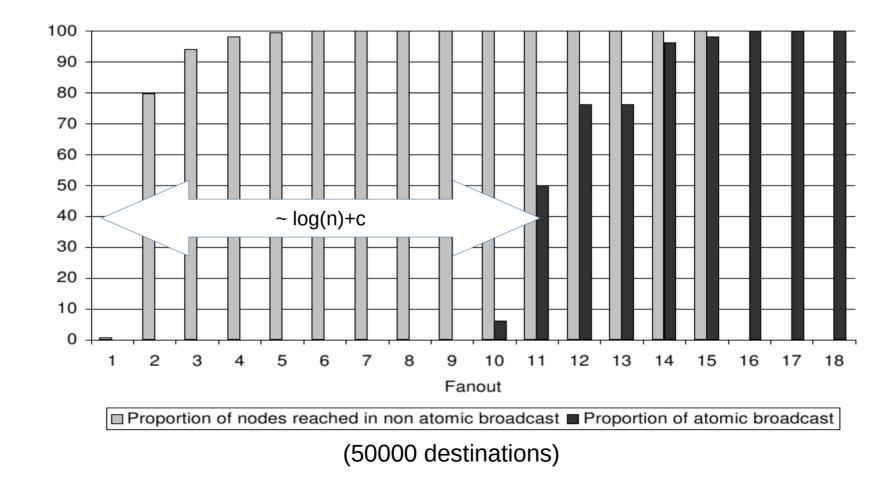
# Roadmap

- Epidemic event dissemination and efficiency
- Distributed aggregation

### Epidemics and Information dissemination

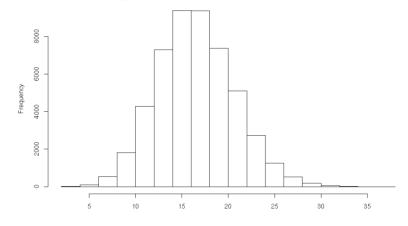
- Similarity with epidemics:
  - Sender = contagious = spreads rumor
  - Receiver = infected = knows rumor
  - Ignores duplicated = recovered = old news...
- Interesting parameters:
  - -n size of the population
  - f number of targets

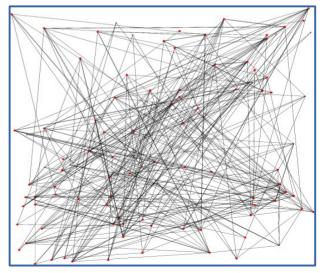
### Fanout vs Reliability



#### Load-balancing and redundancy

- Distribution of traffic on nodes and links:
  - Normal
  - Mean = fanout
- *f-1* useless payload copies for each destination!
- Not using nodes and links with higher capacity
- Using expensive links as much as cheap ones





# Lazy dissemination

- Defer sending the payload (lazy transmission)
  - Equivalent to eager transmission (minor increase in probability of failure)
  - Saves bandwidth, assuming that the payload is much larger that a control message with the event id

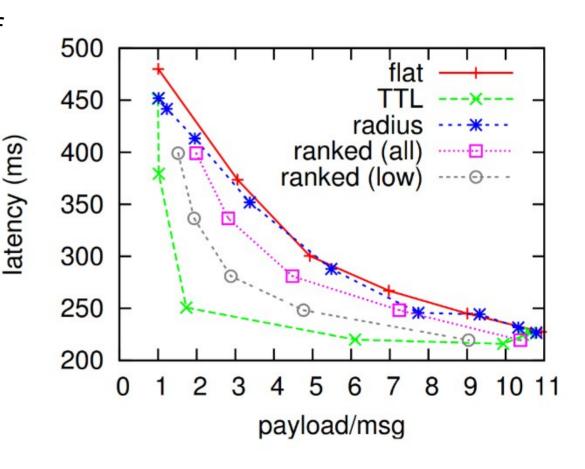


#### Emergent structure

- Manipulate eager vs. lazy transmission such that the protocol achieves efficiency goals with high probability
  - Using cheap network links
  - Using large capacity nodes
  - Reduces redundant payload copies
- Decision based on local information:
  - Stateless: Decisions are independent
  - Stateful: Decision based on previous observations

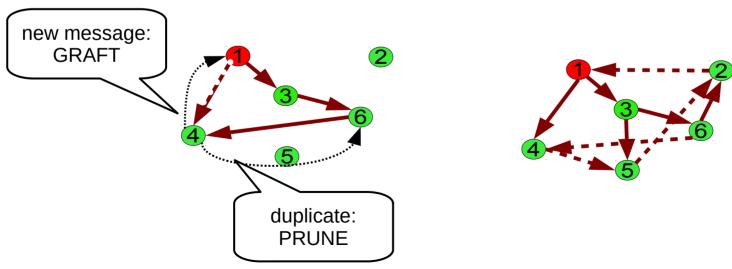
#### Time-to-live

- Observation: Probability of a transmission being a duplicate is:
  - 0 in first round
  - minimal in 2nd round
  - <u>...</u>
  - 1 in latest round
- Use eager for first k hops achieves <2 payloads with good latency



# Push-Lazy-Push Tree (aka "plumtree")

- Start by using eager transmission:
  - When receiving duplicates, ask sender to PRUNE
  - When receiving annoucements for unknown messages, as sender to GRAFT



#### References

• P. T. Eugster, R. Guerraoui, A.-M. Kermarrec, and L. Massoulie, "Epidemic information dissemination in distributed systems," IEEE Computer, vol. 37, no. 5, pp. 60–67, May 2004.

http://dx.doi.org/10.1109/MC.2004.1297243

• J. Leitao, J. Pereira, and L. Rodrigues, "Epidemic Broadcast Trees," in 2007 26th IEEE International Symposium on Reliable Distributed Systems (SRDS 2007), Oct. 2007, pp. 301–310. http://dx.doi.org/10.1109/SRDS.2007.27

### Distributed aggregation

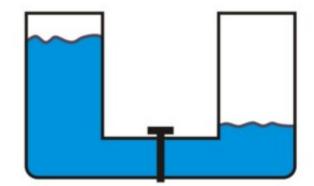
- Computation of aggregate functions:
  - Max, Top-K (idem for Min, ...)
    CAI: Comutative, Associative, and Idempotent
  - Count, sum
- Avoid collecting all values at a single node

### Distributed aggregation (max, ...)

- Each node i starts with estimate e = v<sub>i</sub>
- Exchange estimates with node j
- When receiving e<sub>j</sub>, make e<sub>i</sub> = f(e<sub>i</sub>, e<sub>j</sub>)
- Right answer after enough time for each "opinion" to impact the whole network: T = log n + c times

# Distributed aggregation (average)

- Each node i starts with estimate e = v<sub>i</sub>
- Exchange estimates with node j
- When receiving  $e_j$ , make  $e_i = f(e_i, e_j)$
- Right answer only if exchanges are atomic

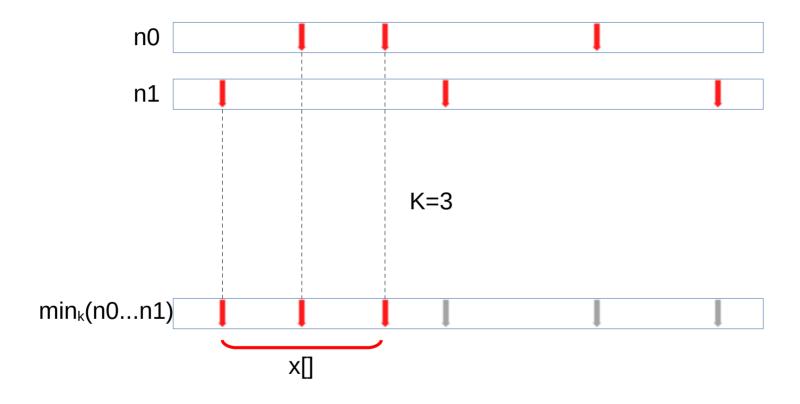


- Strategies to avoid duplication/leaks:
  - Use multiple samples (newscast)
  - Keep a current account (flow)

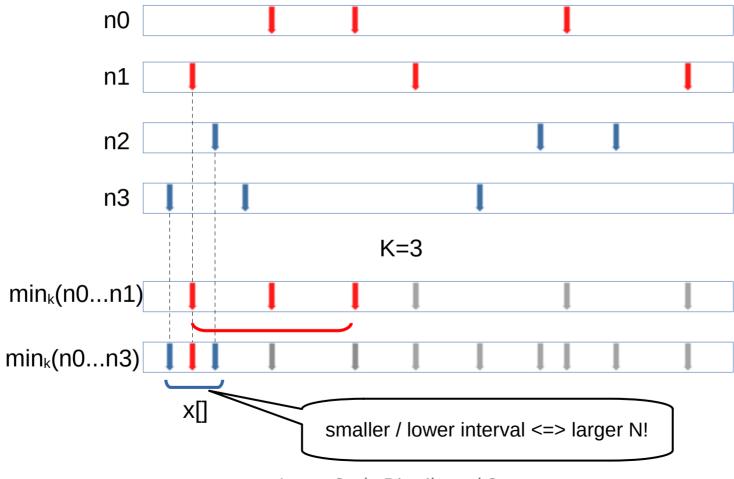
### Distributed aggregation (count)

- Count can be obtained from average:
  - one node starts with value 1, all others with 0
  - count = 1/average
- Can be obtained from max/min:
  - extrema propagation

# Extrema propagation (intuition)



# Extrema propagation (intuition)



### Distributed aggregation (count/sum)

- Each of N nodes selects a vector x[] of K random values
- Nodes exchanges vectors and keep minimal values seen
  - Eventually, all nodes have the same values!
- Repeat until vector x[] is unchanged for T rounds
- Estimate count N from resulting vector x[]

• Can be generalized to compute  $\Sigma v_i$ , therefore can also compute averages

#### References

- M. Jelasity, W. Kowalczyk, and M. van Steen, "An approach to massively distributed aggregate computing on peer-to-peer networks," in 12th Euromicro Conference on Parallel, Distributed and Network-Based Processing, 2004. https://doi.org/10.1109/EMPDP.2004.1271446
- C. Baquero, P. Almeida, R. Menezes, and P. Jesus, "Extrema Propagation: Fast Distributed Estimation of Sums and Network Sizes," IEEE Trans. Parallel Distrib. Syst., vol. 23, pp. 668–675, Apr. 2012.

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