Fault-Tolerant Computing in Wireless Ad Hoc Networks

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Notes

- Names in brackets, as in [Xyz00], refer to a document in the list of references
- There might be some slight differences with the slides on CD
 - The final version will be available at http://www.research.ibm.com/people/c/chockler

Disclaimer

- Fault tolerance in wireless networks is a new rapidly evolving research area
 - This tutorial is by no means exhaustive
 - Many interesting topics not covered in the tutorial due to lack of time
- The material selection reflects to a large extent my personal taste and experience
 - Most results are theoretical
 - Only a small portion was implemented

Wireless Ad Hoc Networks

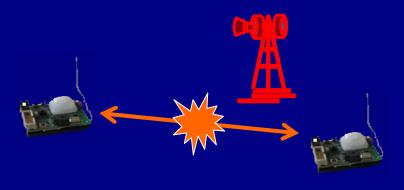
- Radio-equipped devices
- Spontaneous connectivity
 - No networking infrastructure





Failures in Wireless Networks

- Device failures
 - Limited battery life
 - Small size and fragility
 - Software bugs
- Message loss
 - Collision, interference, hidden terminals





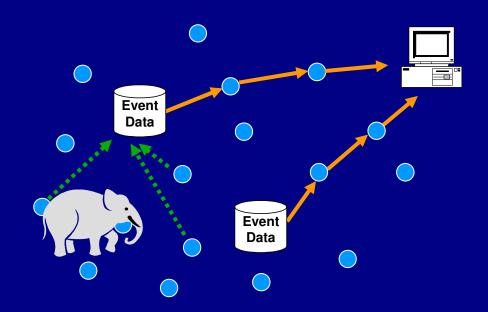


More Limitations

- No unique IDs
- Unknown topology
- Inaccurate knowledge of location
- Drifting clocks
- Mobility

Robustness to Failures

- Many applications could live with besteffort guarantees
 - E.g., data collection, aggregation, querying, monitoring, etc...



Robustness to Failures

Well-defined
 guarantees are crucial
 for mission critical
 tasks

Emergency response

Coordinated lander guidance

Rover navigation

Autonomic flight and traffic control

Coordinated UAVs



Supporting Robustness

- Develop a suite of services (*middleware*) to mask failures
 - Well-defined guarantees
 - Comprehensive
 - Powerful
 - Realistic
 - Simple to understand and use
 - Modular

Fault-Tolerance Middleware

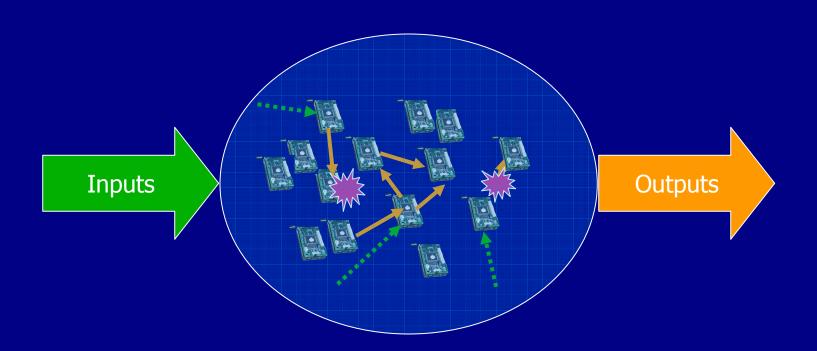
- Local infrastructure
 - Local agreement
 - State machines
 - Virtual nodes
- Global infrastructure
 - Round synchronization
 - Broadcast
 - Quorums
- Applications

Fault-Tolerance Middleware

- Local infrastructure
 - State machines and virtual nodes
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Local Infrastructure

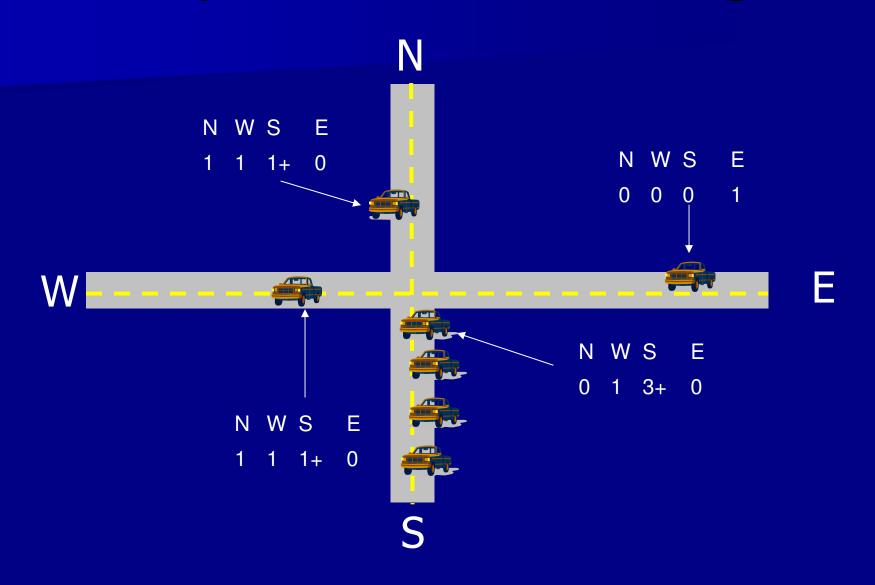
 Objective: create a single reliable entity from a collection of closely coupled, unreliable devices



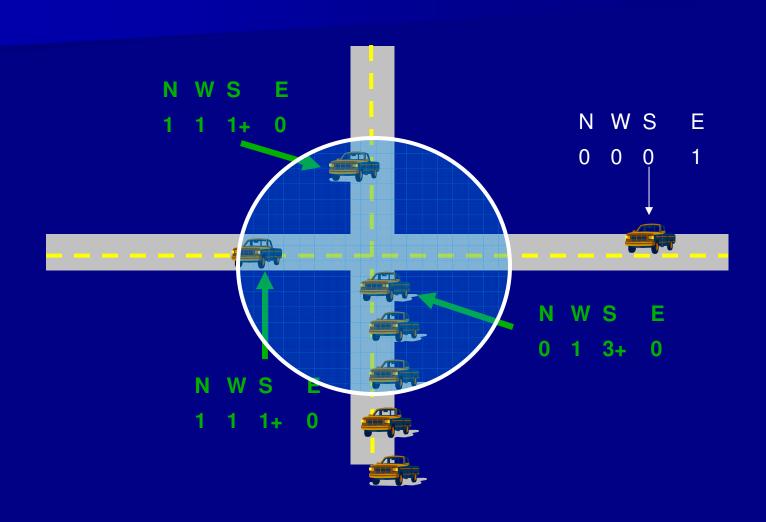
Local State Machine

- All the nodes within the communication range of one another emulate a persistent state machine
 - Inputs: environment stimuli
 - Outputs: consistent actions based on the state machine transition function

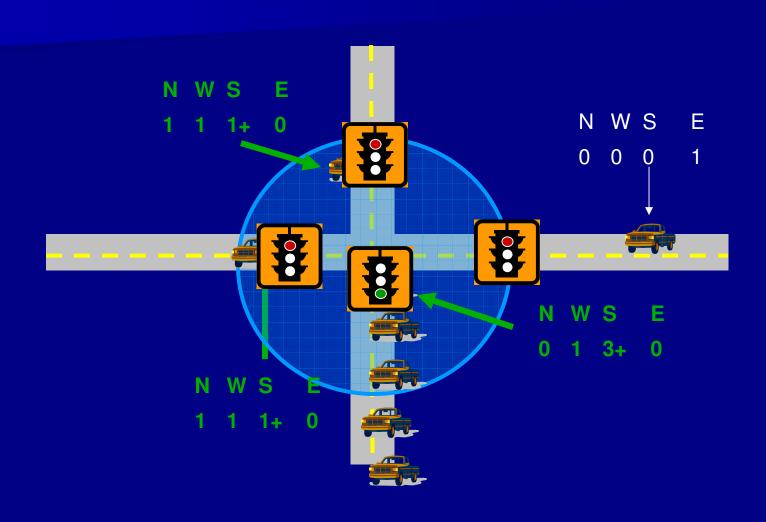
Example: Virtual Traffic Lights



Example: Virtual Traffic Lights



Example: Virtual Traffic Lights



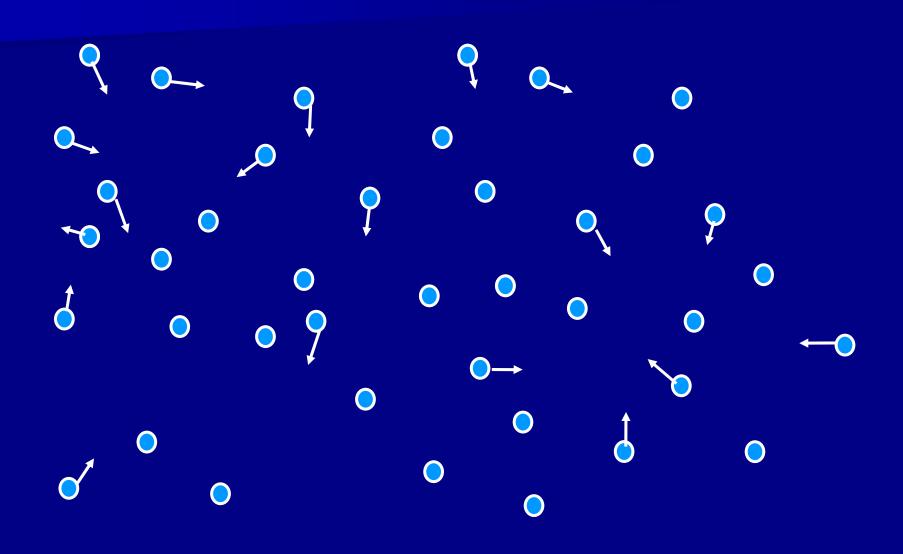
Fault-Tolerance Middleware

- Local infrastructure
 - State machines and virtual nodes
 - Local agreement
- Global infrastructure
 - Round synchronization
 - Broadcast
 - Quorums

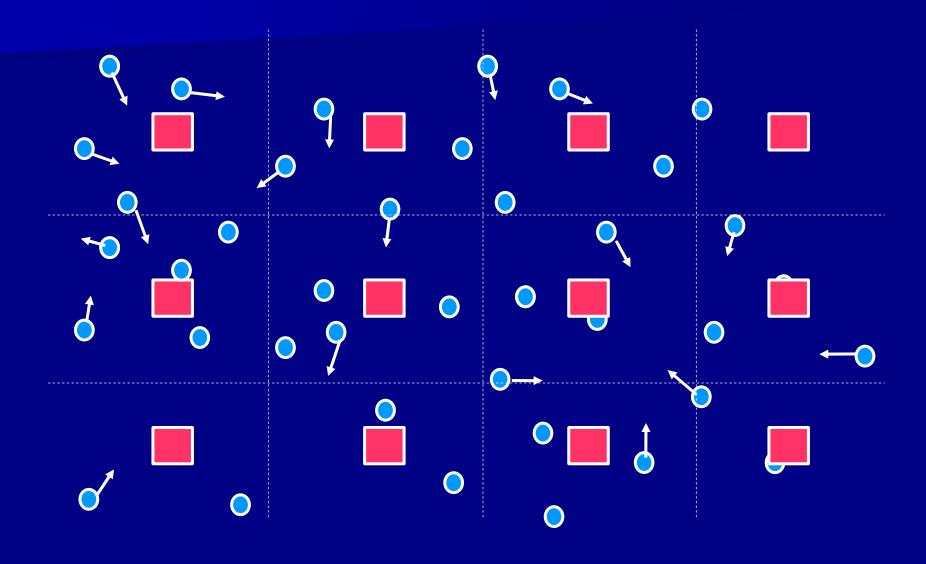
Virtual Nodes

- Emulate a persistent virtual node in each locality populated by physical nodes
- Input: message ← recv()
- Output: send(vn,message)
- The applications are deployed at virtual nodes as though they are real nodes
 - Programmers do not need to care about "peculiarities" of wireless networks

Virtual Nodes



Virtual Nodes



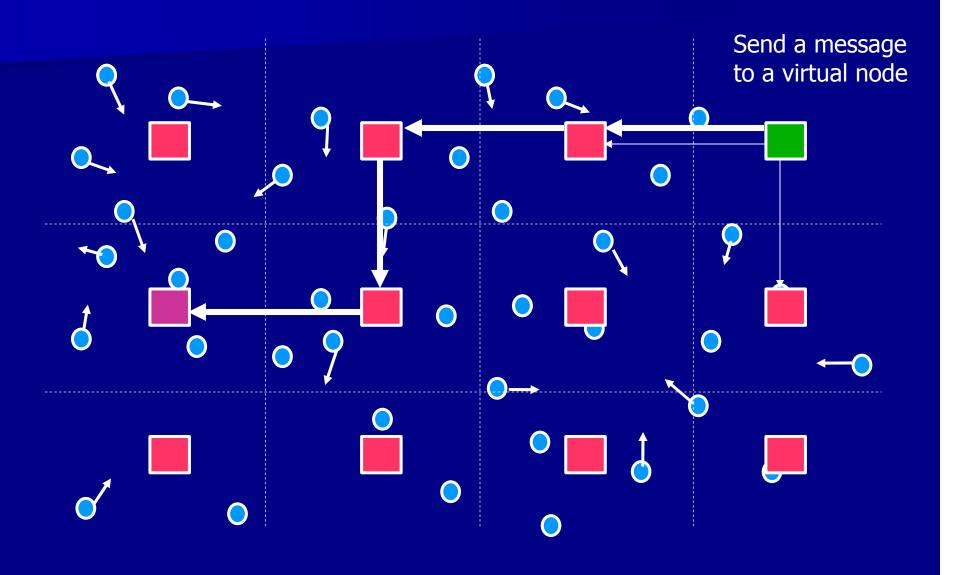
Applications

- Location management
- Routing
- Tracking
- Motion coordination
- Traffic management
- Traffic coordination
- Many others

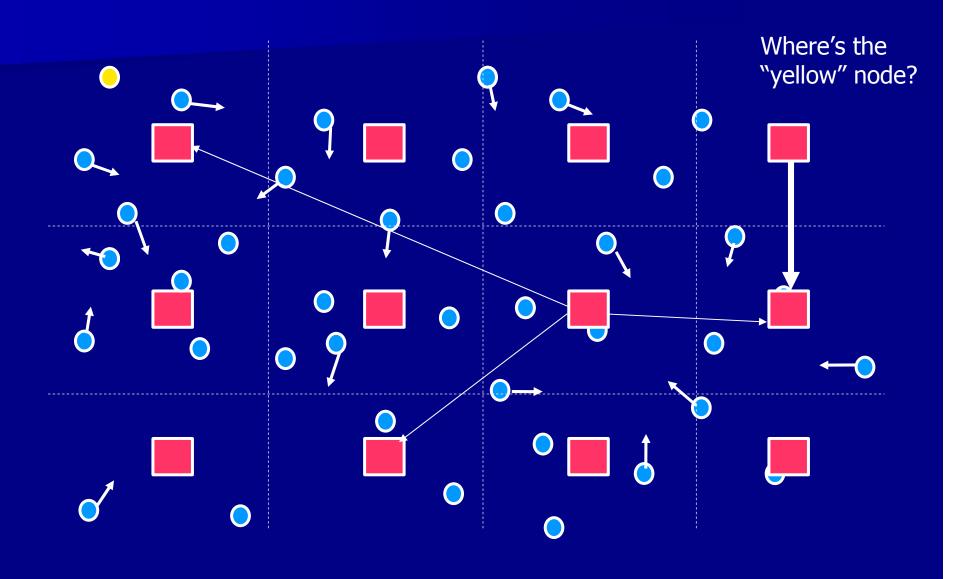
GeoCast Routing

- Location-based routing
 - Requires knowing precise location
- Use broadcast to disseminate messages to the neighbors
- The neighbor closest to the destination will forward the message in the same manner

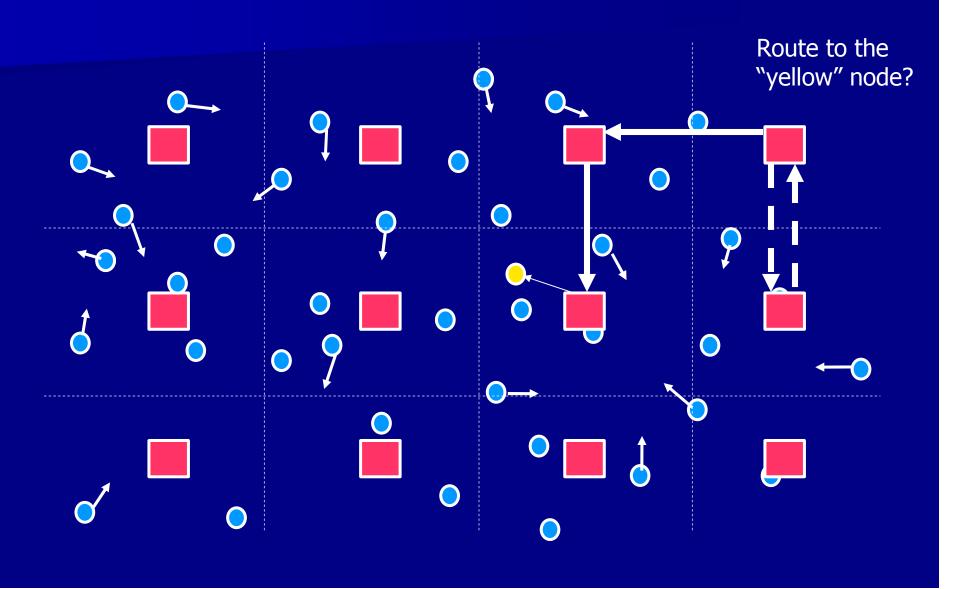
GeoCast Routing



Home Location



Point-to-Point Routing



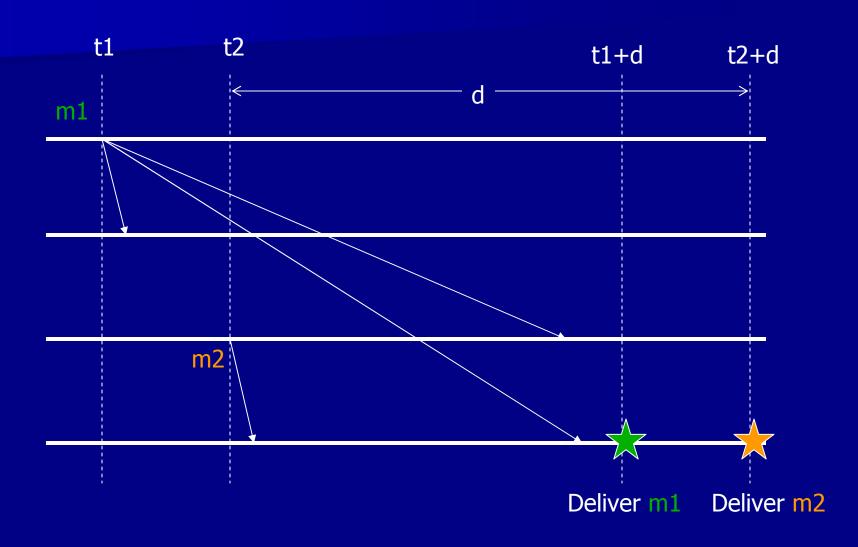
Implementing a Virtual Node

- State-machine replication [8]
- Replicate the virtual node state at the physical nodes within the region
- Broadcast each received message within the region using a total-order broadcast
- Total-order broadcast (TO-Broadacst): messages are delivered at the same order at all nodes

Implementing a Virtual Node [5,6,7]

- Tight clock synch within a region
- Location/time awareness (GPS)
- Known bound on message delay d
- One node is a leader

Implementing TO-Broadcast [5,7,8]



Implementing TO-Broadcast [5,7,8]

- Affix message M a unique timestamp:
 - -TS := clock()
- Locally broadcast (M,TS,Sender)
- For each received (m,ts,sender) such that clock()=ts+d, move (m,ts,sender) to outbuffer
- Deliver messages in the out-buffer in the timestamp order
 - Break ties using the sender id

Implementing a Virtual Node

- A physical node receives m:
 - TO-Broadcast(m) within the region
- Upon delivery of a TO message m:
 - Perform the transition triggered by m
 - If a new message m' should be sent:
 - If (leader?) then send m' to the destination VN using Geocast

Towards a More Realistic Model

- The VN implementation relies on
 - Reliable local broadcast
 - Known identifiers
 - Known number of nodes
- These assumptions are not always realistic in wireless networks
- How to relax these assumptions in a meaningful way?

The New Model

- Unknown number of nodes, no unique ids
- Messages can be lost due to collision and other anomalies
- Round-based computation: Each process in each round:
 - 1. Broadcasts a message
 - 2. Receives messages
 - **3.** Performs computation
 - Messages broadcast in r are received in r

Round-Based Computation

- Computation proceeds in rounds
- In each round r, each process P:
 - Sends a message
 - Receives messages
 - Performs computation
- Might seem unrealistic, but can be easily emulated with
 - Bounded drift clocks and message delay
- We'll see an implementation later

Local Agreement

- Can we still implement a VN?
 - What is necessary for that?
- Single-hop environment
- We investigate this using a local

agreement problem →

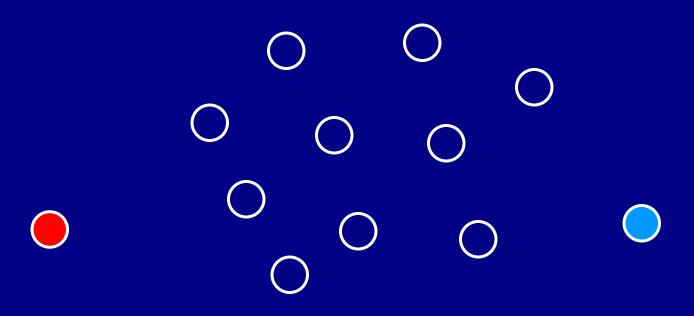
Fault-Tolerance Middleware

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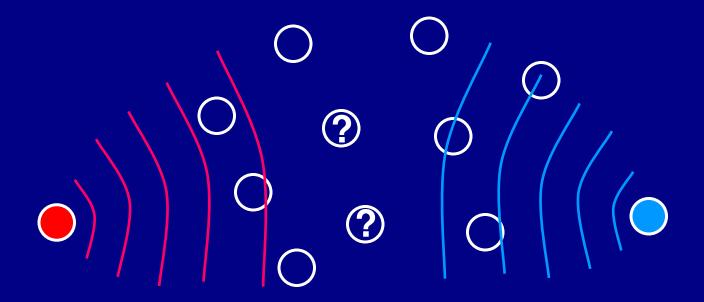
Local Agreement (Consensus) [2,3]

- Start with possibly different input values
- Agreement:
 - Different inputs → (eventually) the same output at each participating node
- Validity:
 - Each output is the input of some process

Characterizing Collision



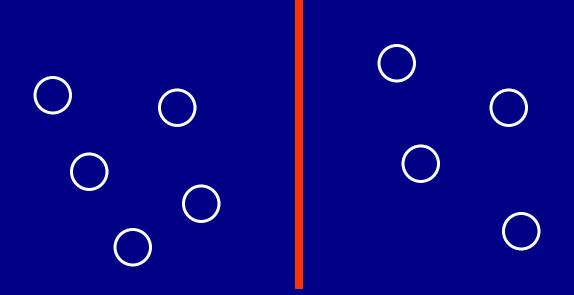
Characterizing Collision



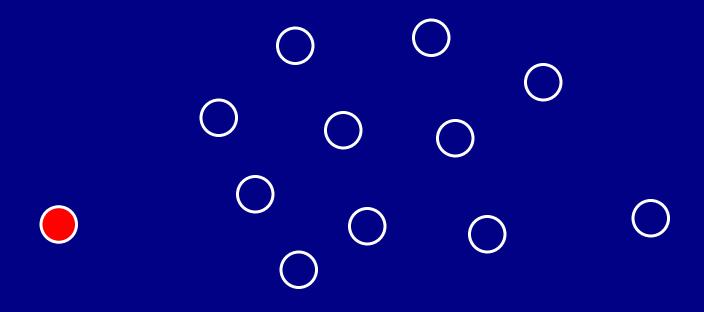
Non-Uniform Collisions: Any node can loose any message in any round

Unfortunately...

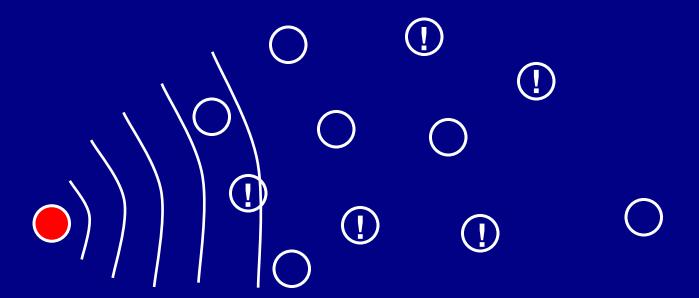
Agreement is **impossible** with non-uniform collisions.



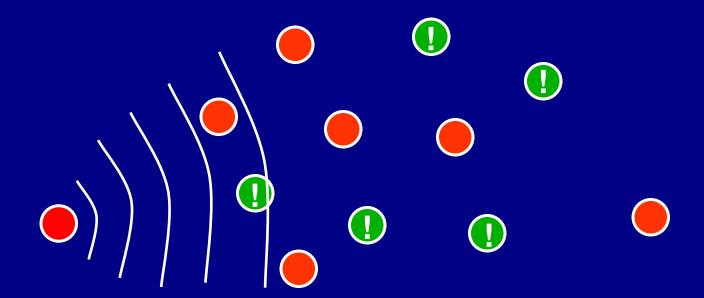
Solution: Collision Detection



Collision Detection



Collision Detection

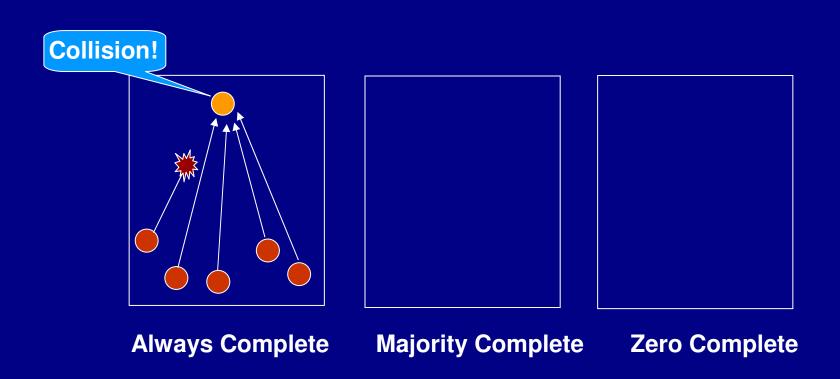


Receiver-based collision detection

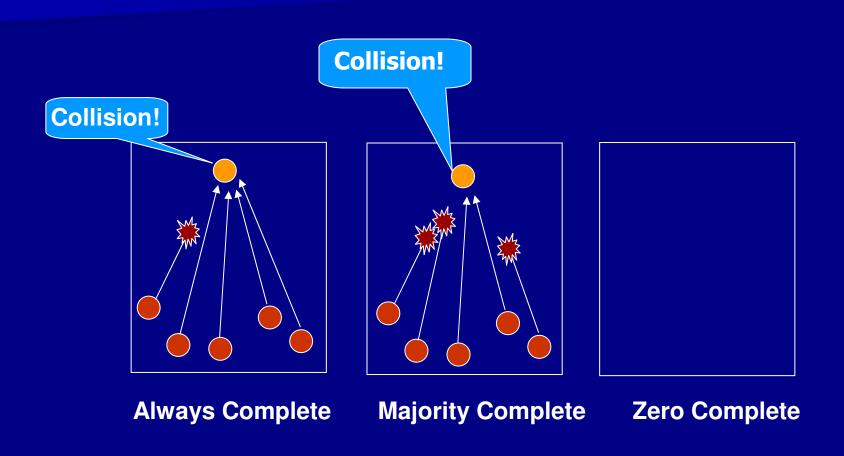
Collision Detectors

- Properties:
 - Completeness: If P loses a message, ...
 - Accuracy: If P loses no messages, ...
- Question: Find a CD which is both <u>realistic</u> and <u>powerful</u> enough to solve agreement <u>efficiently</u>

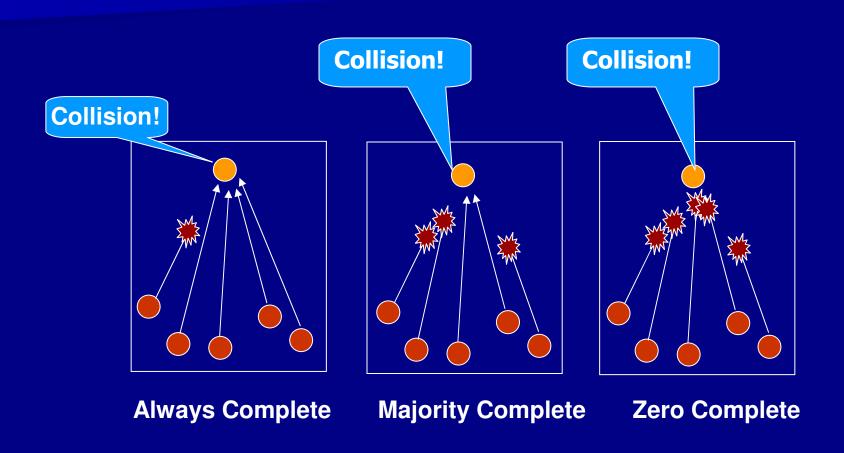
Completeness Degrees



Completeness Degrees



Completeness Degrees



Collision Detector Classes

	(Always) Accurate: A	Eventually Accurate: <i>A</i>
(Always) Complete: C	AC	◊AC
Majority Complete: Maj-C	Maj-AC	Maj- ◊AC
0-Complete: 0- <i>C</i>	0-AC	0- <i>◊AC</i>

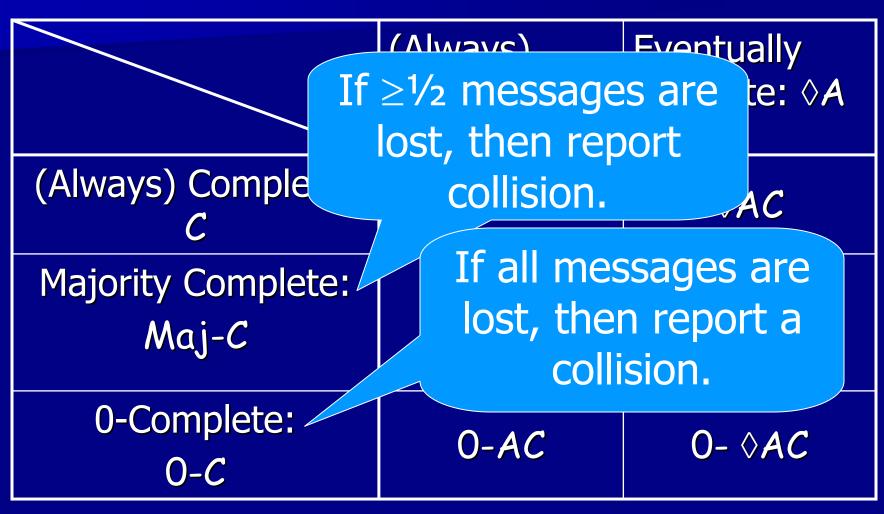
Agreement is impossible with $\Diamond C$

Collision Detector Classes

	(Always)	Eventually
	If ≥½ messages are te: ◊A	
	lost, then report	
(Always) Comple	collision.	AC
C		
Majority Complete: Maj-C	Maj-AC	Maj- ◊AC
0-Complete: 0- <i>C</i>	0-AC	0- <i>◊AC</i>

Agreement is impossible with OC

Collision Detector Classes



Agreement is impossible with OC

	No Collision	
	Freedom	
\mathcal{AC}	$\Theta(\log V)$	
maj- \mathcal{AC}	$\Theta(\log V)$	
0- <i>AC</i>	$\Theta(\log V)$	
$\Diamond \mathcal{AC}$	Impossible	
maj- $\Diamond \mathcal{AC}$	Impossible	
0-\$AC	Impossible	

(Always) Accurate

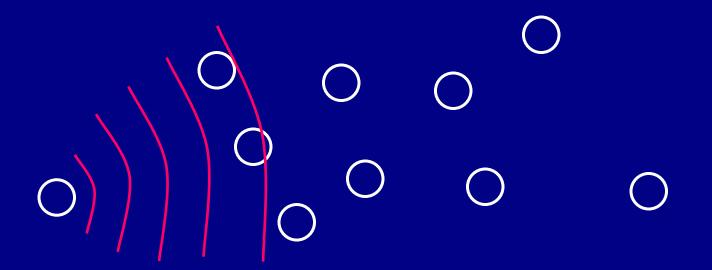
	No Collision Freedom
\mathcal{AC}	$\Theta(\log V)$
maj- \mathcal{AC}	$\Theta(\log V)$
0-AC	$\Theta(\log V)$
$\Diamond \mathcal{AC}$	Impossible
maj-♦AC	Impossible
0-\$AC	Impossible

	No Collision
	Freedom
\mathcal{AC}	$\Theta(\log V)$
maj- \mathcal{AC}	$\Theta(\log V)$
0- <i>AC</i>	$\Theta(\log V)$
$\Diamond \mathcal{AC}$	Impossible
maj- $\Diamond \mathcal{AC}$	Impossible
0- <i>♦ AC</i>	Impossible

Eventually Accurate

Eventual Collision Freedom

Eventually, if only 1 node broadcasts...



Eventual Collision Freedom

- Eventually, if only 1 node broadcasts, then no collision occurs
- Use a contention manager
 - Outputs "active/passive" at each node
 - Implementation: randomized backoff, e.g.

Eventual Collision Freedom

- Eventually, if only 1 node broadcasts*, then no collision occurs
- Use a contention manager
 - Outputs "active/passive" at each node
 - Implementation: randomized backoff, e.g.

- * If ≤ b nodes broadcast, then no collisions
 - —
 b is an unknown MAC layer constant
 - − b could be as low as 1

	No Collision
	Freedom
\mathcal{AC}	$\Theta(\log V)$
maj- \mathcal{AC}	$\Theta(\log V)$
0- <i>AC</i>	$\Theta(\log V)$
$\Diamond \mathcal{AC}$	Impossible
maj- $\Diamond \mathcal{AC}$	Impossible
0-\$AC	Impossible

	Eventual Collision	No Collision
	Freedom	Freedom
\mathcal{AC}	$\Theta(1)$	$\Theta(\log V)$
maj- \mathcal{AC}	$\Theta(1)$	$\Theta(\log V)$
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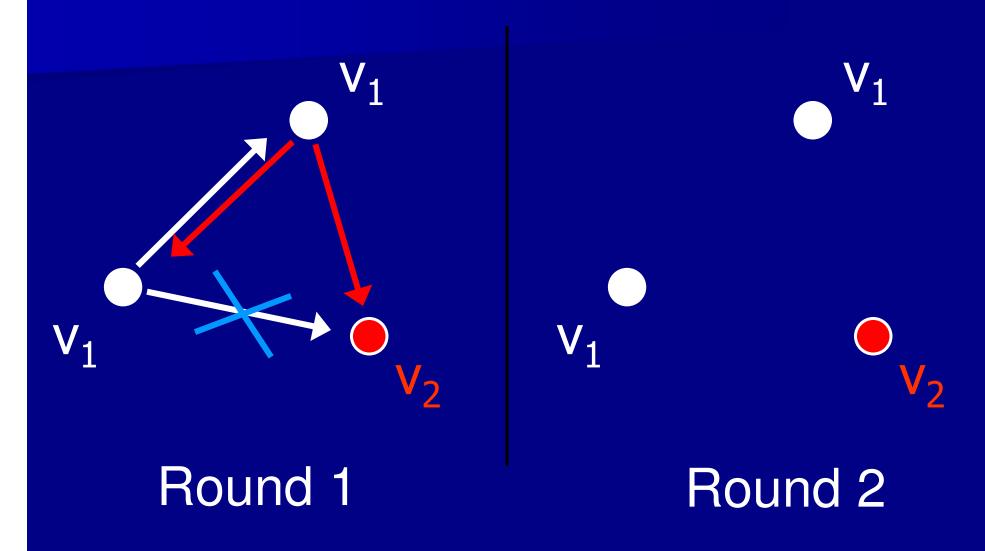
- Estimate := initial value
- Algorithm executes in super-rounds:
 - Round 1: Vote round
 - Active nodes vote on a value
 - If no collisions detected, then estimate := the smallest value heard
 - Round 2: Veto round
 - Anybody can veto if collision detected in Round 1
 - If nobody vetoes, then decide estimate and halt

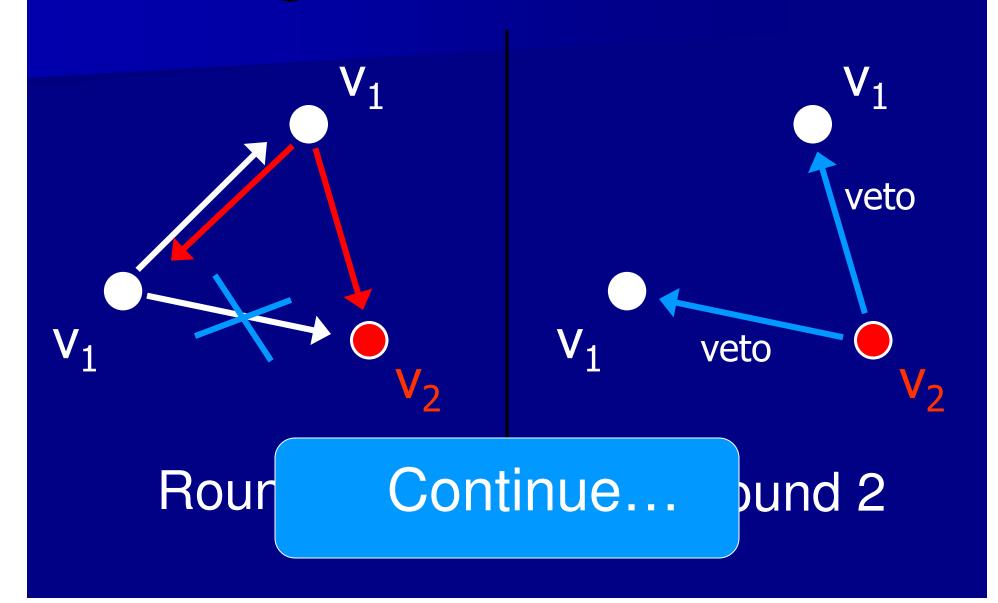
Agreement with $\Diamond AC$



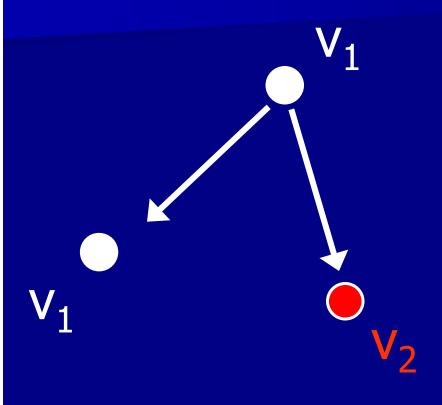
 V_1

Round 1

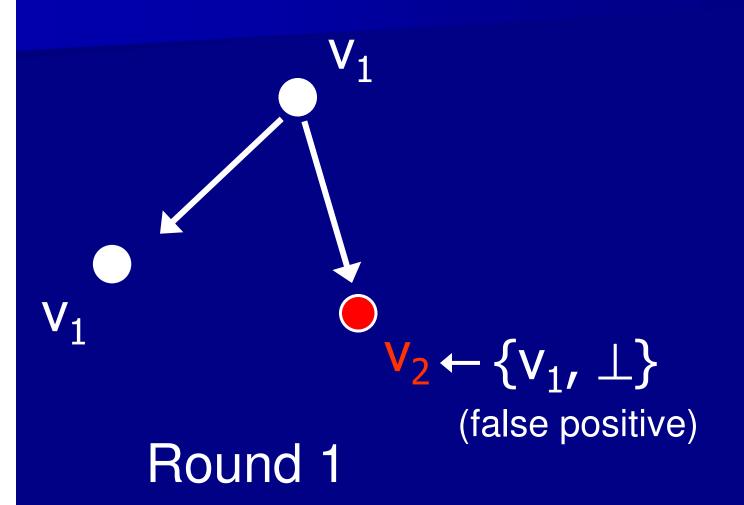


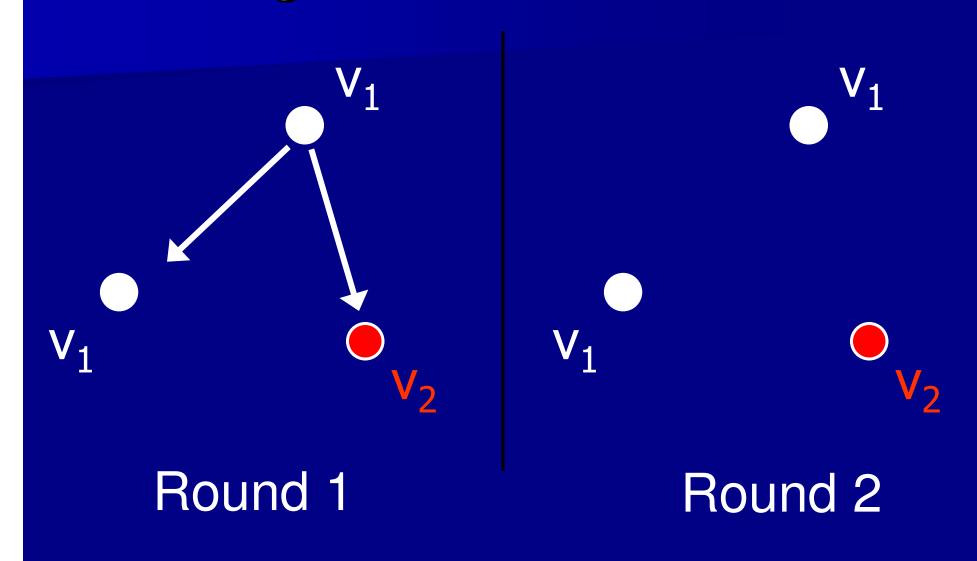


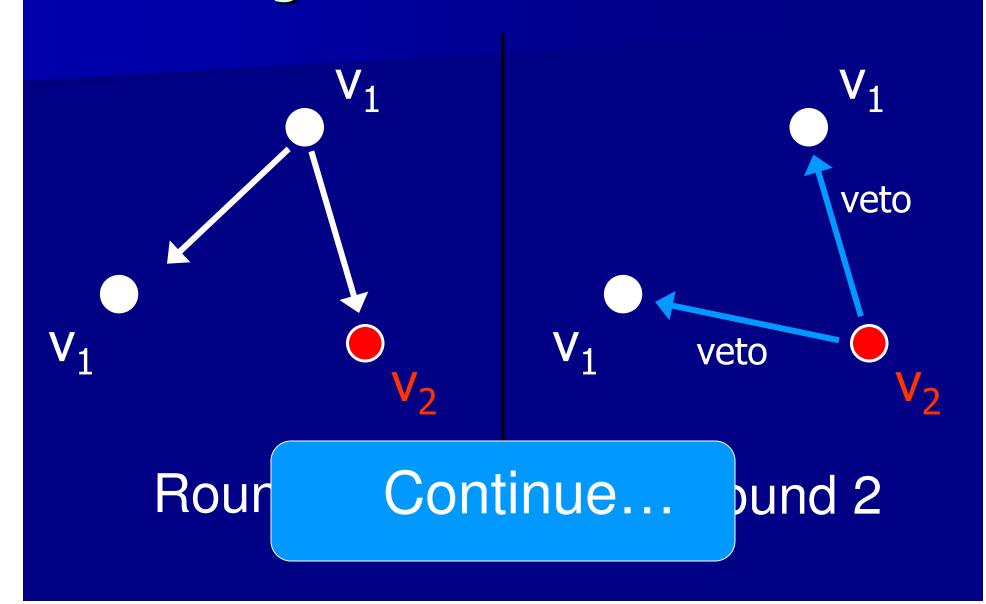
Agreement with $\Diamond AC$



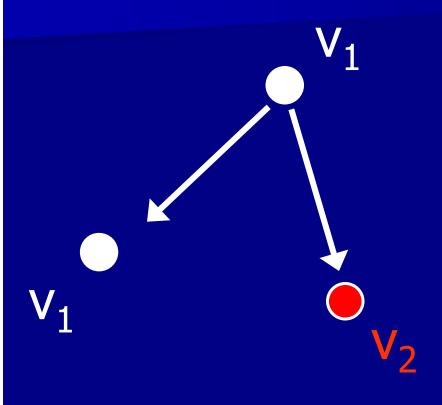
Round 1





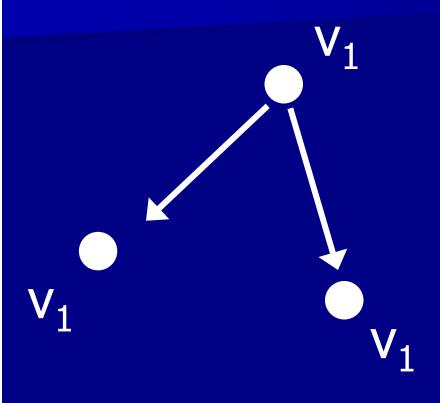


Agreement with $\Diamond AC$

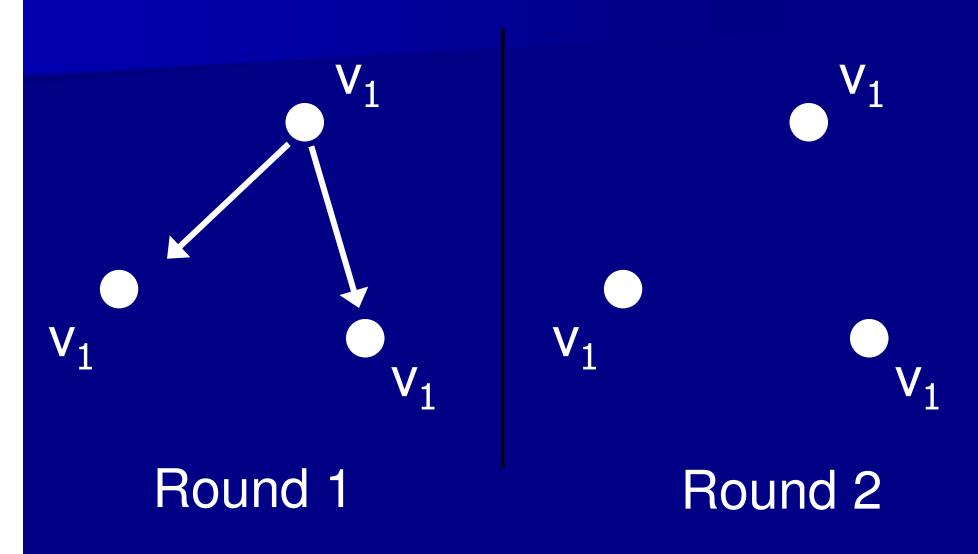


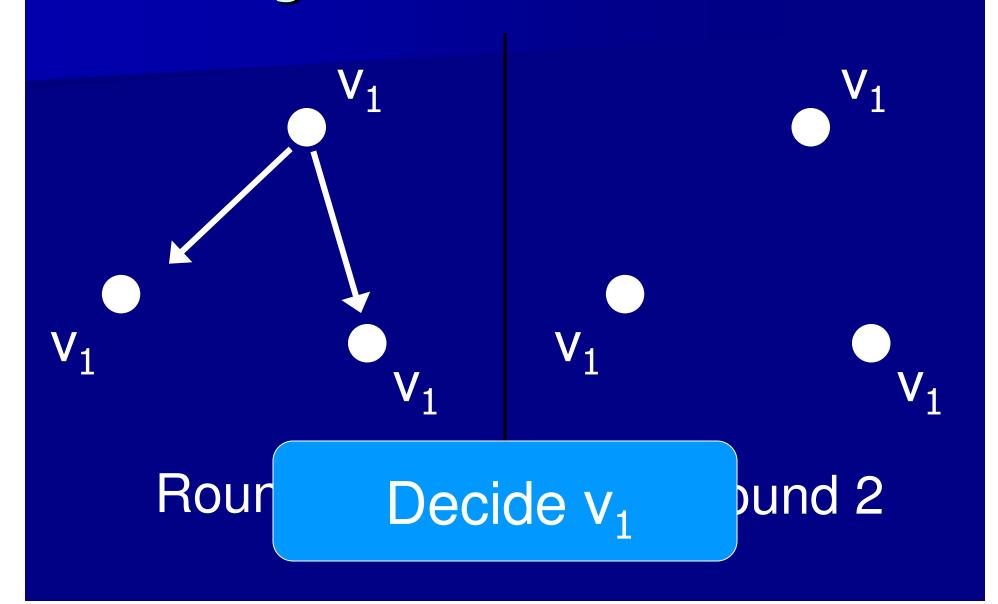
Round 1

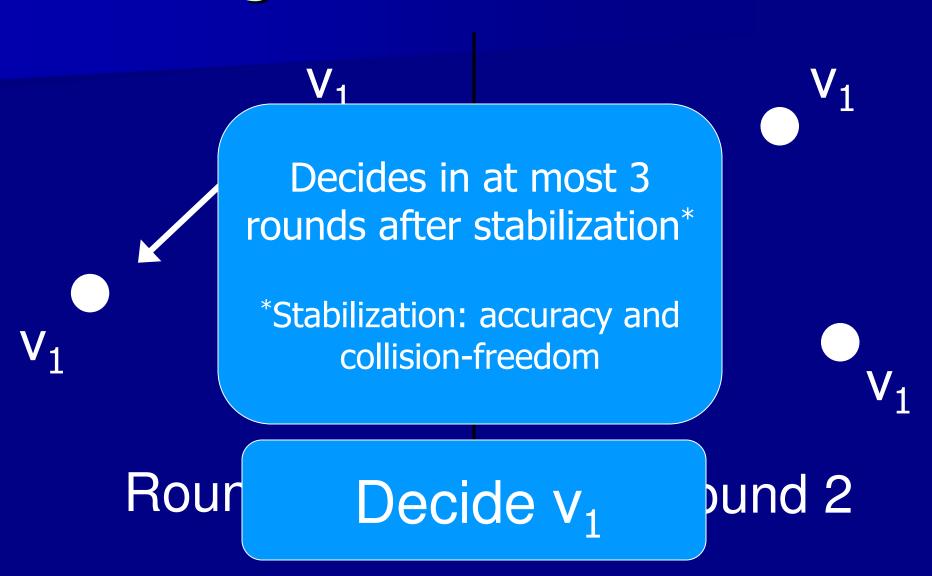
Agreement with $\Diamond AC$



Round 1

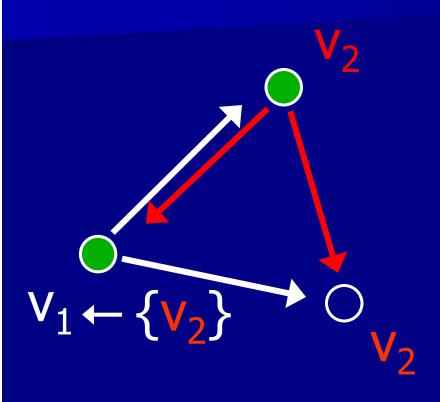




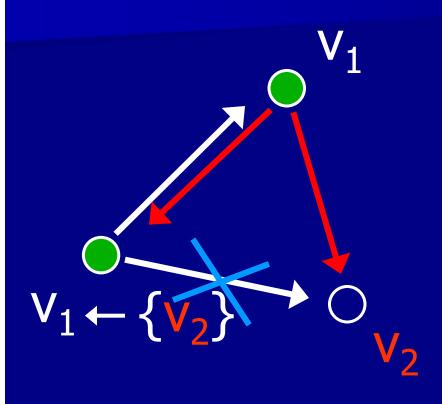


	Eventual Collision	No Collision
	Freedom	Freedom
\mathcal{AC}	$\Theta(1)$	$\Theta(\log V)$
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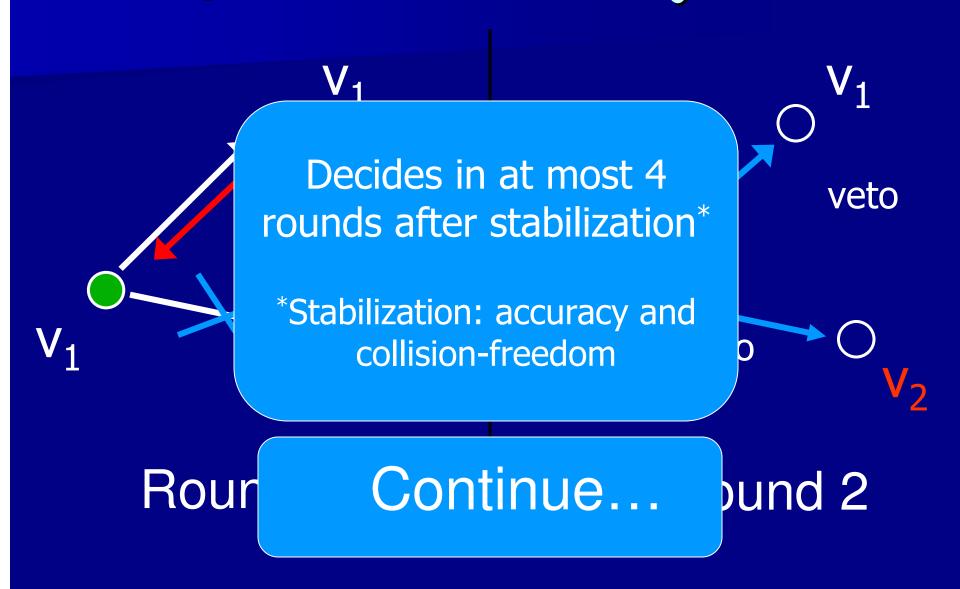
- Estimate := initial value
- Algorithm executes in super-rounds:
 - Round 1: Vote round
 - Active nodes vote on a value
 - If no collisions detected, then estimate := the smallest value heard
 - Round 2: Veto round
 - Veto if collision detected in Round 1 or #different values received in Round 1 > 1
 - If nobody vetoes, then decide estimate and halt



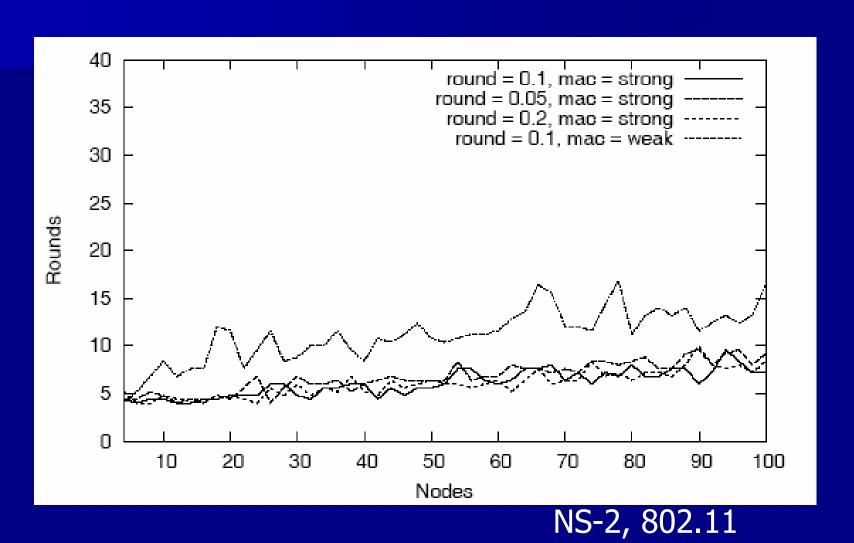
Round 1



Round 1



Maj-◊AC Consensus: Simulations



Consensus with CD

	Eventual Collision	No Collision	
	Freedom	Freedom	
\mathcal{AC}	$\Theta(1)$	$\Theta(\log V)$	
maj- \mathcal{AC}	$\Theta(1)$	$\Theta(\log V)$	
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maj- $\diamondsuit \mathcal{AC}$	$\Theta(1)$	Impossible	
0-\$AC	$\Theta(\log V)$	Impossible	

V is the value domain

Agreement with $\frac{1}{2}$ -AC

½-complete, accurate collision detector

$$\begin{array}{c|c}
O & O \\
O & O
\end{array}
\qquad
\begin{array}{c}
\downarrow & O & O \\
\downarrow & O & O \\
V_1 & V_2
\end{array}$$

2^r broadcast schedules for the first r rounds
 |V| possible values
 For k < log(|V|), at most |V|/2 broadcast schedules to follow →

Exists two values resulting in the same broadcast schedule of length k

Agreement with $\frac{1}{2}$ -AC

½-complete, accurate collision detector

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\end{array}$$

2^r broadcast schedules for the first r rounds
 |V| possible values
 For k < log(|V|), at most |V|/2 broadcast schedules to follow →

Exists two values resulting in the same broadcast schedule of length k

- Everybody broadcasts its initial value
 - estimate := $\bot \in M$? initVal : min(M)
 - abort := 0
- For every bit B of estimate:
 - If (B = 1 or abort) then broadcast Veto
 - If received something and B=0, abort := 1
- If abort, then broadcast Veto
 - If nothing received, decide estimate, halt

prepare

> propose

decide

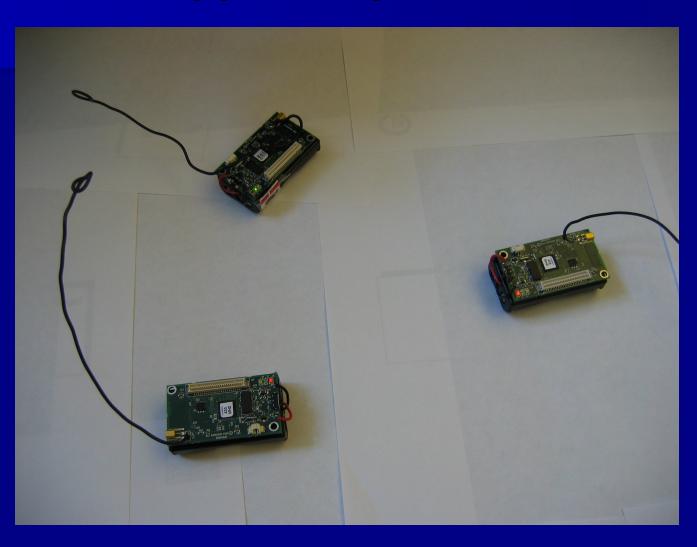
Implementing Collision Detection

- Carrier sensing
 - CSMA: 802.11, 802.15.4, sensor wireless MAC
 - Sense carrier in the idle mode
- Cyclic Redundancy Check (CRC)
- Preamble detection
 - Normally, preamble is only detected in the synchronization state
 - If detected in the receive state → collision

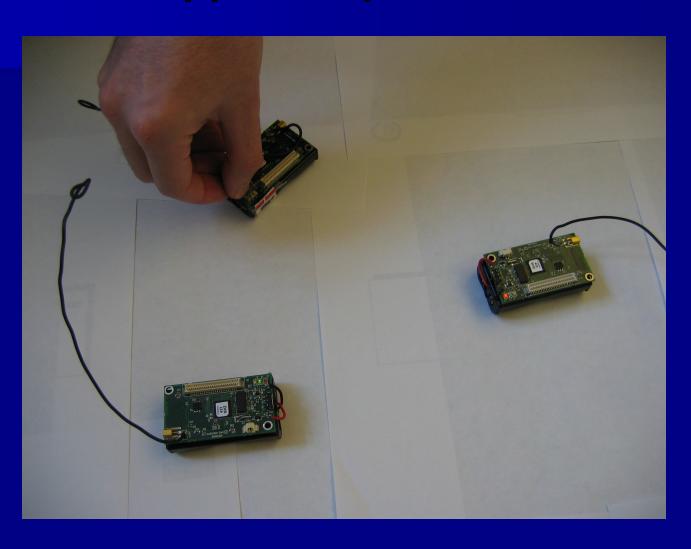
Local Agreement: Conclusions

- Local infrastructure for realistic collision models
 - Non-uniform collision
- Necessary building blocks:
 - Collision detector for consistency
 - Contention manager for progress
- The most realistic yet powerful collision detector is Maj-◊AC

Prototype Implementation



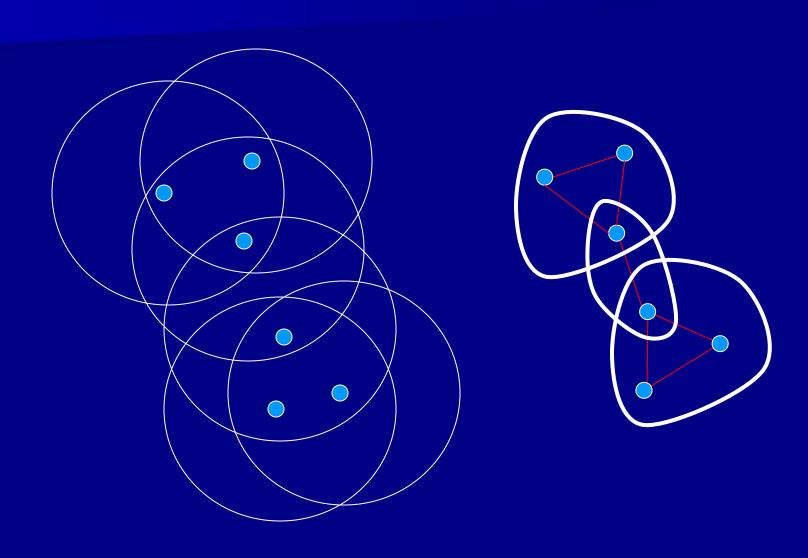
Prototype Implementation



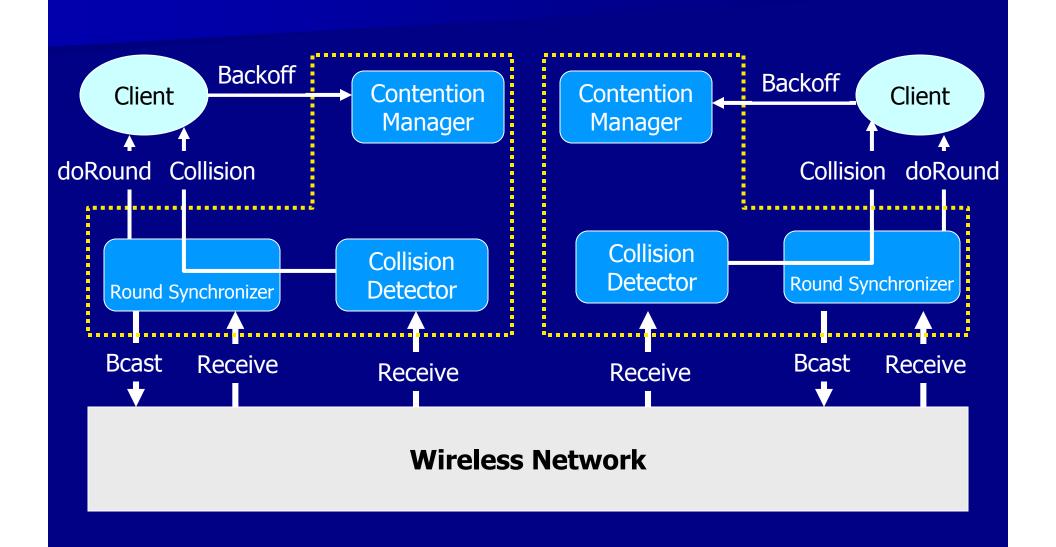
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Multi-Hop Wireless Networks



Middleware for Multi-Hop Networks [1]



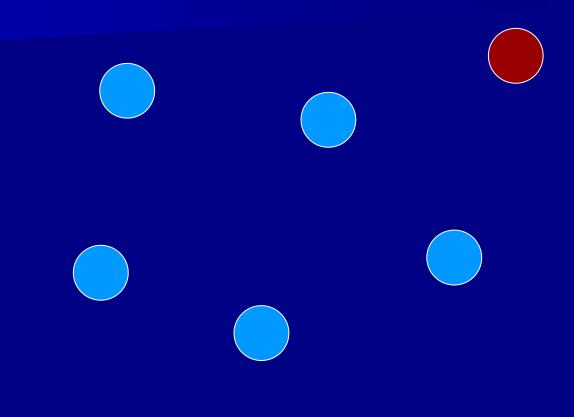
Round Synchronizer

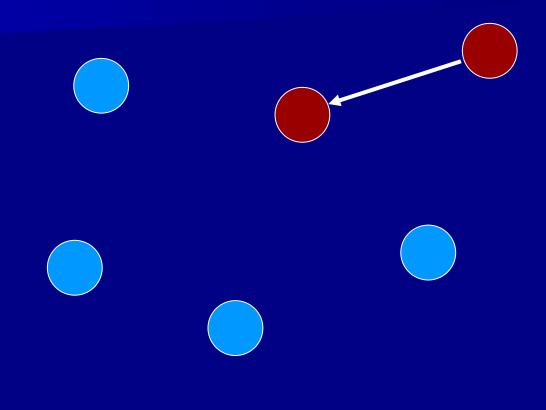
- Supports synchronous protocols
- Nodes synched with neighbors

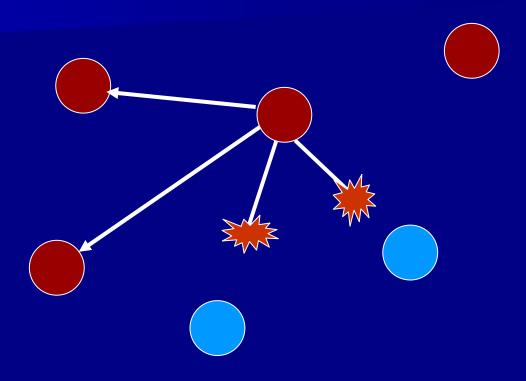
During each round r, a protocol running on process p is allowed to broadcast one or zero messages to p's neighbors. The component returns to the protocol a set containing all round r messages sent by p's neighbors and successfully received by p.

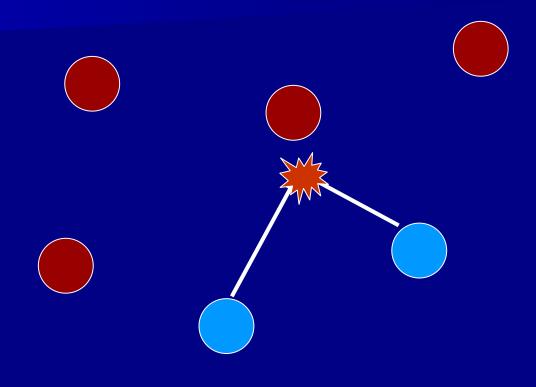
An Example: Reliable Broadcast

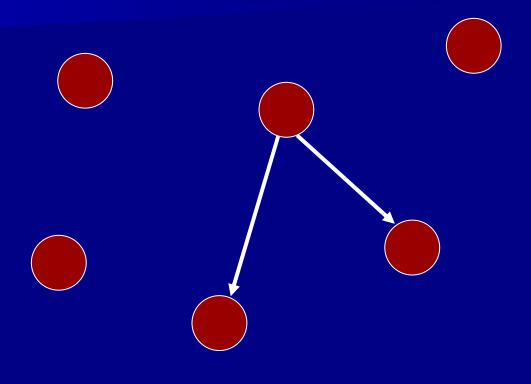
```
init(m);
       started \leftarrow false
       active \leftarrow false
       msg \leftarrow m
   doRound rnd, msgs[], collision)
      if -nd \mod 2 = 0 then // Receive a message in even rounds.
          if (not started) and (|msqs| > 0) then
             started \leftarrow true
             msq \leftarrow msqs[0]
          if collision then
             return veto // Broadcast a veto if receive failed.
          else
             return Ø
       else if rnd \mod 2 = 1 then // Receive a veto in odd rounds.
          if started then
             if (not collision) and (|msgs| = 0) and active then
17
                 halt() // If no vetoes, then done.
             else if (collision) or (|msgs| > 0) then
                 active \leftarrow Backoff(eTooMany)
             else if (not collision) and (|msgs| = 0) and (not active) then
                 active \leftarrow Backoff(eTooFew)
             if active then
                return msq //Broadcast message.
```

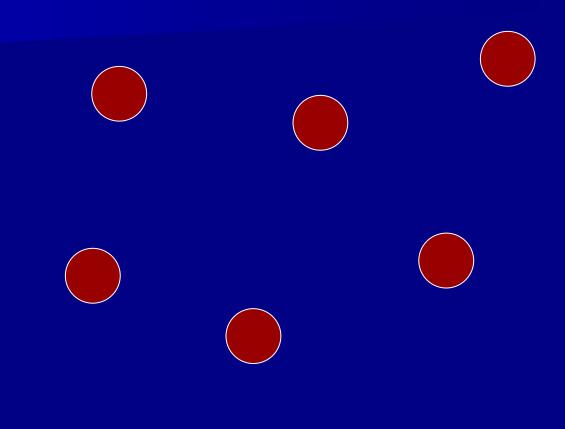












Implementing Round Synchronizer

- Use "start" message, or collision detection to synch with neighbors
- Use local timer to maintain local synch for bounded number of rounds
- Periodic resynchronizations required
 - Compensate for clock drift

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Quorum Systems

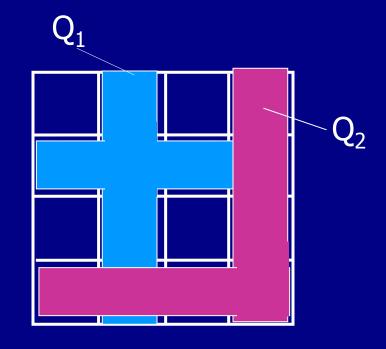
- Universe *U* of servers
- **Quorum system:** $Q \subseteq 2^U : \forall Q_1, Q_2 \in Q : Q_1 \cap Q_2 \neq \emptyset$
 - Intersection for coordination and information sharing among clients
- Advantages: Improved load and availability
- Applications: data replication, data dissemination, mutual exclusion, etc.

Quorum System Examples

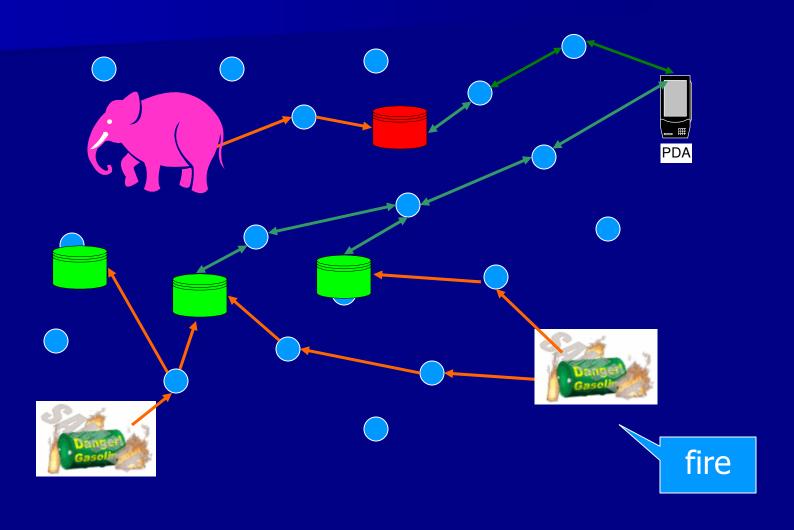
Threshold QS: a set of all sets containing a majority of servers in

Grid QS:

S_1	S ₂	S ₃	S ₄
S ₅	S ₆	S ₇	S ₈
S ₉	S ₁₀	S ₁₁	S ₁₂
S ₁₃	S ₁₄	S ₁₅	S ₁₆



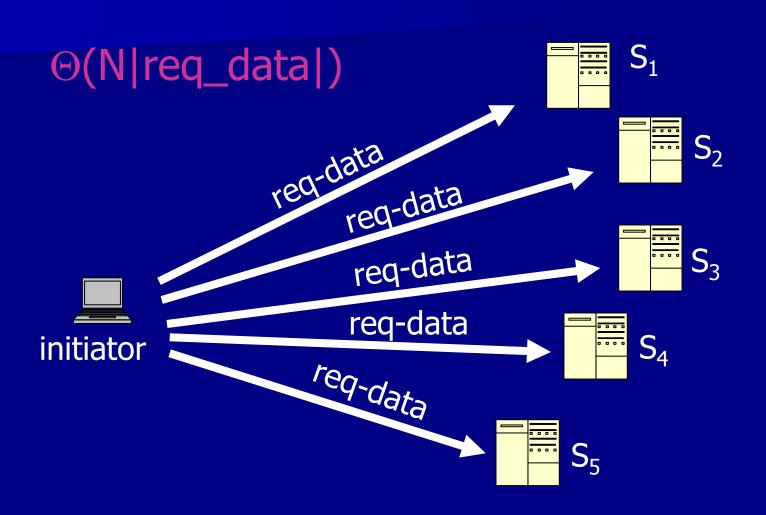
Data-Centric Event Storage



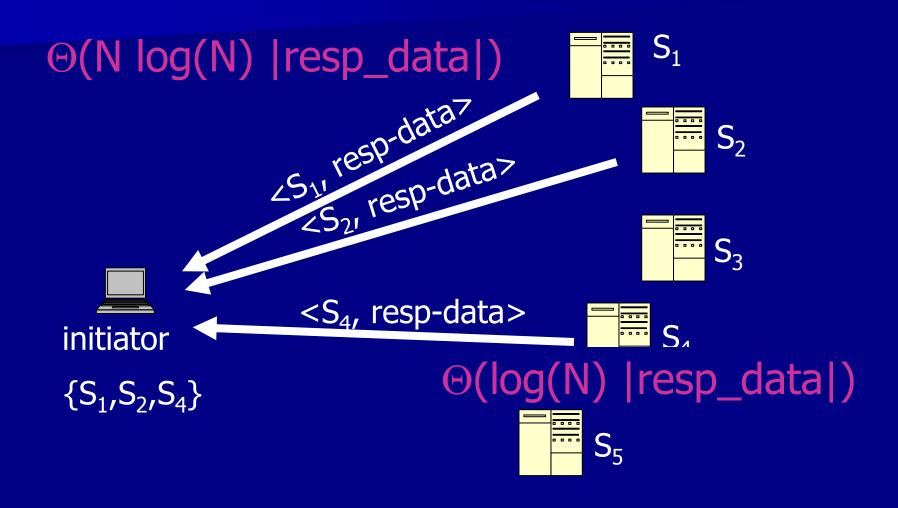
Accessing Quorums

- Client (initiator) contacts servers until a full quorum of replies is collected
 - Variety of ways for doing that
- The initiator must be able to identify responding nodes
 - Majority: count responses
 - Grid: identify the square to fill

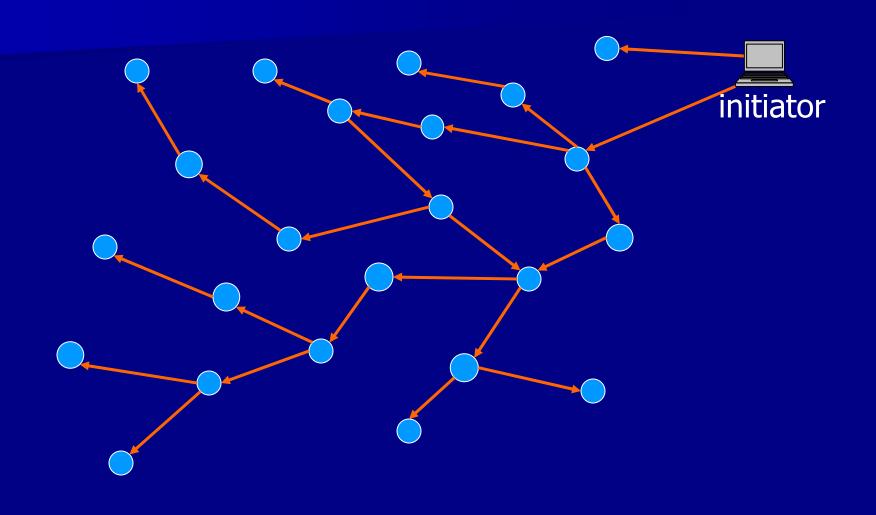
Accessing Quorums



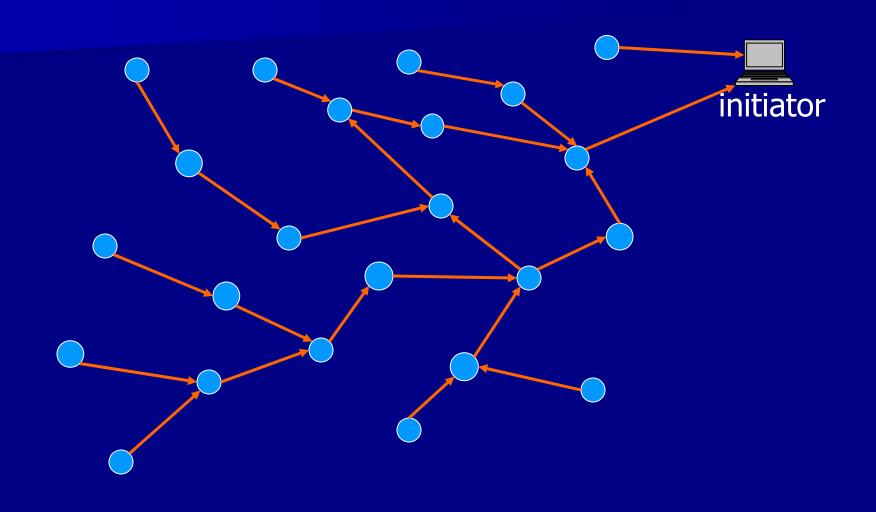
Accessing Quorums



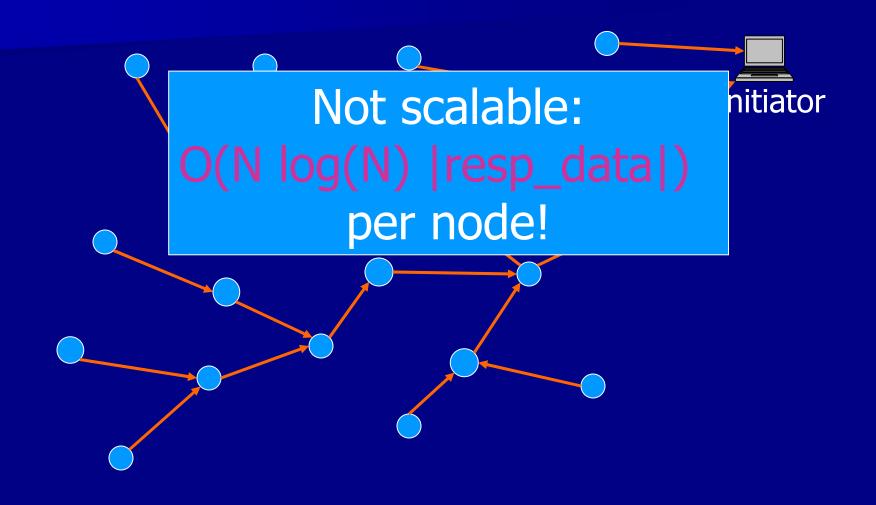
Accessing Quorums in Sensornets



Accessing Quorums in Sensornets



Accessing Quorums in Sensornets



Communication Complexity of QS

- #bits transmitted in one quorum access
 - Does not depend on the access pattern

	P-to-p (threshold)	Gossip (threshold)	Best that was known
Total	$\Theta(N \log(N))$	$O(N^2 \log(N))$	$\Theta(\sqrt{N}\log(N))$
Per- node	$\Theta(\log(N))$	$O(N\log(N))$	Gossip: $\Theta(\sqrt{N}\log(N))$ p-to-p: $\Theta(\log(N))$

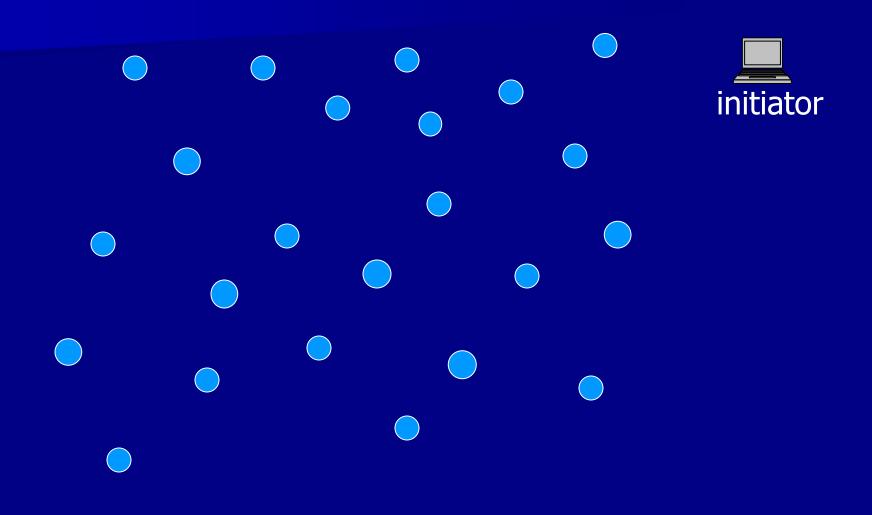
 $| req_{data} | = | resp_{data} | = O(\log(n))$

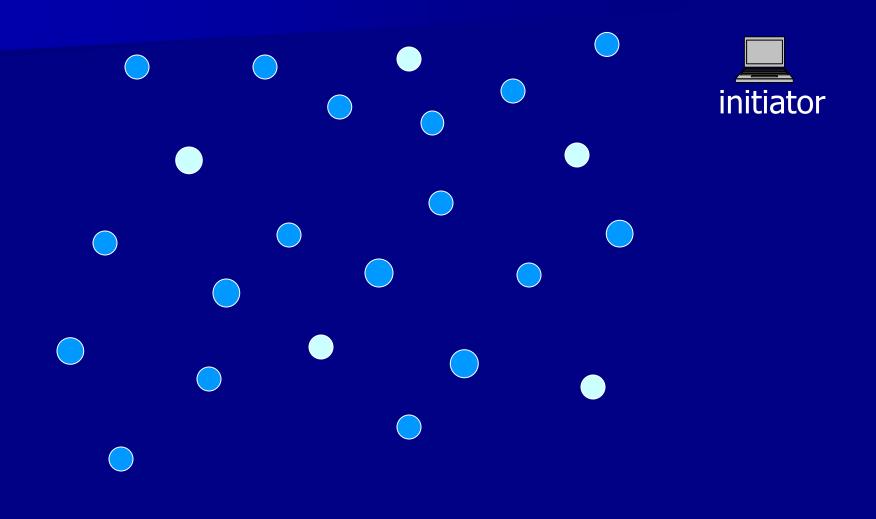
Low Bandwidth Quorum Access [4]

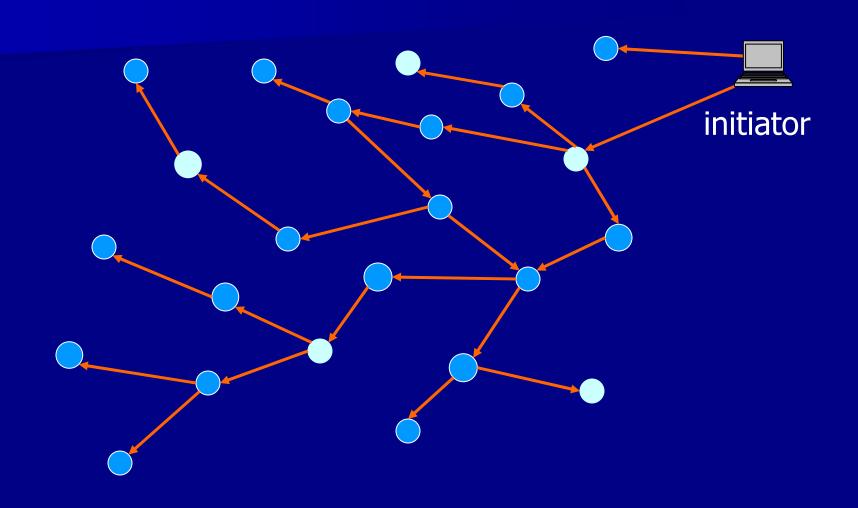
- ➤ Idea: Use probabilistic sampling to achieve polylog communication complexity
 - ► Use gossip (flooding) for robustness

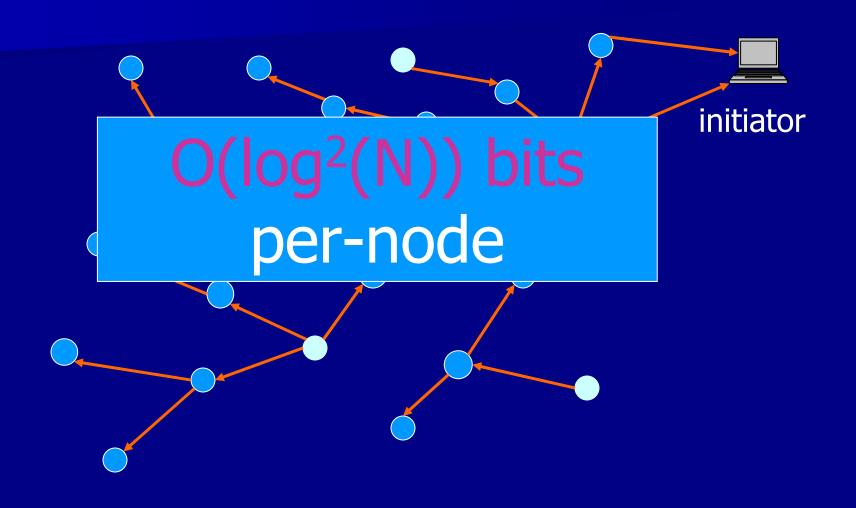
Sampling-Based Quorum Access [4]

- Initiator:
 - (1) $X:=\Theta(c \log(N))$ -sized sample of nodes chosen U.A.R.
 - (2) Gossip <X,req_data>
- Everybody forwards <X,req_data>
- Node p:
 - If p in X, gossip back <X,resp_data>
- Everybody forwards <X,resp_data>









Why this works?

- Lemma: If X is a sample of size Θ(c log(N)) chosen U.A.R, then % of nodes that receive the request is the same in both X and the entire population w.h.p.
- Proof: Follows from a Chernoff bound
 - See the paper for details

Updates vs. Queries

- Update: Ensure that enough nodes got the data though only a log-sized sample responds
 - The protocol described thus far
- Query: Ensure that the sample "hits" some updated nodes
 - Using samples of size ⊕(c log(N)) guarantees intersection w.h.p.
 - Proof: Chernoff bound and union bound

Adding Fault Tolerance

- Assume a fraction p of nodes can crash or disconnect
- Modify the access protocol so that only a fraction r of nodes in X is required to respond
 - In the paper: p<0.25, r=0.6</p>
 - p can be made asymptotically close to 0.5

The Initiator Protocol

```
Update(value)

1 sample \leftarrow \mathsf{Random}(S, r)

2 responses \leftarrow \emptyset

3 \mathbf{while} \ |responses| < (1 - p - \tau)r

4 \mathbf{do} \ responses \leftarrow \mathsf{Gossip}(\mathsf{update}, sample, value)

5 \mathbf{return}
```

```
Query()
1 \quad sample \leftarrow \mathsf{Random}(S,r)
2 \quad responses \leftarrow \emptyset
3 \quad \mathbf{while} \mid responses \mid < (1-p-\tau)r
4 \quad \mathbf{do} \quad responses \leftarrow \mathsf{Gossip}(query, sample, \bot)
5 \quad \mathbf{return} \quad responses
```

Quorum Systems Summary

- Low communication complexity is important for environments with scarce resources, such as sensor and ad hoc networks
- Probabilistic, sampling-based QS
 - polylog communication complexity
 - Available as long as ≥50% of nodes are alive and connected

Conclusions

- Middleware for fault-tolerant computing in realistic wireless ad hoc networks
- Low-level components
 - Collision detectors
 - Contention manager
 - Round synchronizer
 - Reliable broadcast
 - Quorums
- High-level components
 - Virtual nodes and state machines
 - Local agreement

Future Work

- Malicious failures
- Weakest collision detector for agreement
- Implementing collision detectors
- More efficient/resilient implementations
- Implementations in real networks
- Applications

References

- [1] G. Chockler, M. Demirbas, S. Gilbert, and C. Newport. A Middleware Framework for Robust Applications in Wireless Ad Hoc Networks. Proceeding of the 43rd Allerton Conference on Communication, Control, and Computing, September, 2005
- [2]G. Chockler, M. Demirbas, S. Gilbert, C. Newport, and T. Nolte. **Consensus and Collision Detectors in Wireless Ad Hoc Networks**. *24th Annual Symposium on the Principles of Distributed Computing (PODC)*, July, 2005
- [3] G. Chockler, M. Demirbas, S. Gilbert, N. Lynch, C. Newport, and T. Nolte. **Reconciling the Theory and Practice of UnReliable Wireless Broadcast.** *International Workshop on Assurance in Distributed Systems and Networks (ADSN)*, June, 2005
- [4] G. Chockler, S. Gilbert, and B. Patt-Shamir. **Communication-Efficient Probabilistic Quorum Systems.** *Proceedings of the International Workshop on Foundations and Algorithms for Wireless Networking (FAWN)*, March, 2006.
- [5] S. Dolev, S. Gilbert, L. Lahiani, N. Lynch, and T. Nolte. Timed Virtual Stationary Automata for Mobile Networks. 9th International Conference on Principles of Distributed Systems (OPODIS), December, 2005
- [6] S. Dolev, S. Gilbert, N. Lynch, A. Shvartsman, and J. Welch. **GeoQuorums: Implementing Atomic Memory in Mobile Ad Hoc Networks.** *Distributed Computing*, 125–155, November, 2005
- [7] S. Dolev, S. Gilbert, N. Lynch, E. Schiller, A. Shvartsman, and J. Welch. **Virtual Mobile Nodes for Mobile Adhoc Networks.** *Proceeding of the 18th International Conference on Distributed Computing (DISC)*, October, 2004.
- [8] L. Lamport. **Time, clocks, and the ordering of events in a distributed system**. Communications of the ACM: 21(7), 1978

URLs:

Virtual Nodes: http://theory.lcs.mit.edu/~sethg/biblio-projects.html#vi

Fault-tolerance middleware: http://theory.lcs.mit.edu/~sethg/biblio-projects.html#consensus

Thank You!