# Fault-tolerant Consensus in Directed Networks

Lewis Tseng

Boston College Oct. 13, 2017

(joint work with Nitin H. Vaidya)

### Fault-tolerant Consensus

Each node has an input

Agreement: good nodes must agree

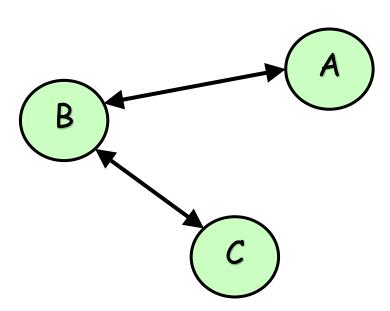
Validity: some constraints on output

Exact vs. Approximate

Termination

### Message-Passing Communication

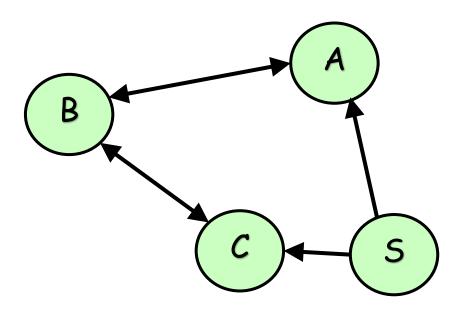
### undirected graph





### Message-Passing Communication

### directed graph



- Partially connected
- links may not be bi-directional

### Goal

Precise characterization of networks that can solve consensus

Known for undirected graphs

Unknown for directed graphs



### Consensus

Fault Model	System/Output		Graph	Results
Crash	Synchronous	Exact		
		Approximate		
	Asynchronous			
Byzantine	Synchronous	Exact		
		Approximate		
	Asynchronous			



### Consensus

Fault Model	System/Output		Graph	Results
Crash	Synchronous	Exact	Undirected	Well-known Results
			Directed	
		Approximate	Undirected	Decentralized Control (e.g., [Tsitsiklis '84]
			Directed	
	Asynchronous		Undirected	[Jadbabaei '03])
			Directed	
Byzantine	Synchronous	Exact	Undirected	[PSL '80] [FLM '85]
			Directed	
		Approximate	Undirected	[Dolev '83] [FLM '85]
			Directed	
	Asynchronous		Undirected	[Dolev '83] [FLM '85]
			Directed	



### Consensus

Fault Model	System/Output		Graph	Results
Crash	Synchronous	Exact	Undirected	Well-known Results
			Directed	PODC '15
		Approximate	Undirected	Decentralized Control (e.g., [Tsitsiklis '84]
			Directed	
	Asynchronous		Undirected	[Jadbabaei '03])
			Directed	PODC '15
Byzantine	Synchronous	Exact	Undirected	[PSL '80] [FLM '85]
			Directed	PODC '15
		Approximate	Undirected	[Dolev '83] [FLM '85]
			Directed	PODC '12
	Asynchronous		Undirected	[Dolev '83] [FLM '85]
			Directed	Open

### Why Directed Networks?

Motivated by properties of wireless links

 Better understanding of network requirements for consensus

 Directed networks considered in several related contexts



#### Past Work on Directed Networks

Decentralized control

[Tsitsiklis '84],[Bertsekas, Tsitsiklis '97],[Jadbabaei et al. '03]

Malicious fault model

[Zhang et al. '12], [LeBlanc et al. '13]

Different problems

[Desmedt, Wang '02], [Bansal et al. '11], [Biely et al. '12], [Pagourtzis et al. '14], [Maurer et al. '14], [Biely et al. '14]

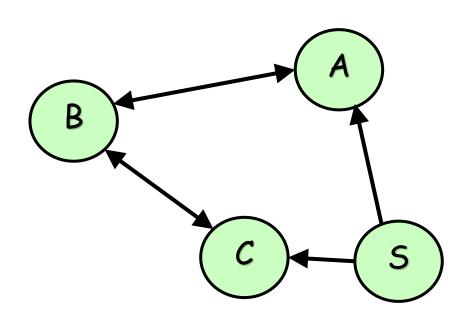
### **Algorithms**

### General Algorithm

topology information

### Iterative Algorithm

local computation



### This Talk: Exact Consensus

General Algorithm:

Crash + Synchronous

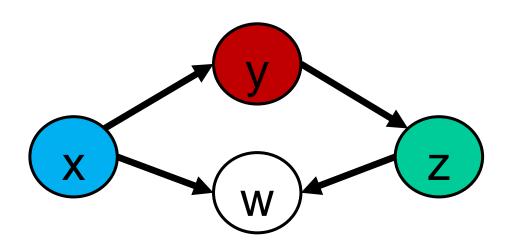
Byzantine + Synchronous

[Tseng and Vaidya, PODC '15]



### Intuition

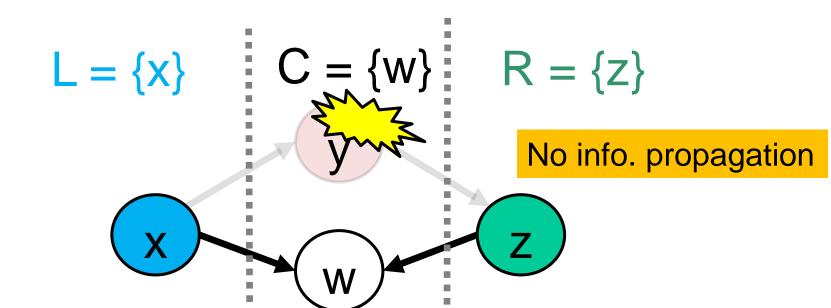
- Remove some nodes
- For any node partition L, C, R,
   either L or R has enough neighbors from outside





### Intuition

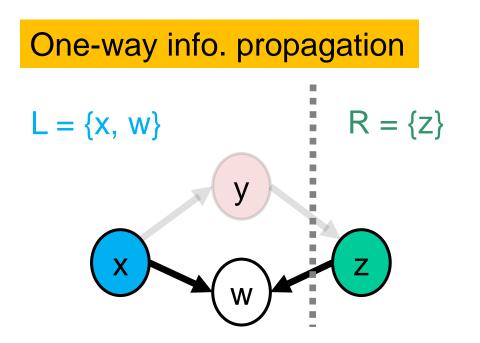
- Remove some nodes
- For any node partition L, C, R,
   either L or R has enough neighbors from outside

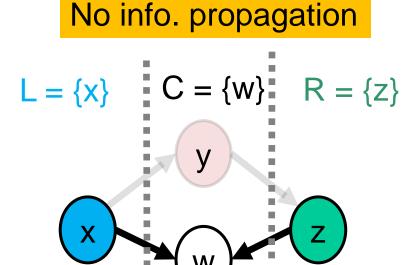




# Why L, C, R?

- Remove some nodes
- For any node partition L, C, R,
   either L or R has enough neighbors from outside





# Crash Failures + Synchrony

### **Exact Consensus**

Each node has a binary input

 Agreement: Good nodes agree on an <u>exact</u> value

Validity: Agreed value is an input at some node

Termination



# Crash in **Undirected** Graphs

#### **Known** result:

n > f and connectivity > f

necessary and sufficient

n nodes, up to f failures

### k-propagate

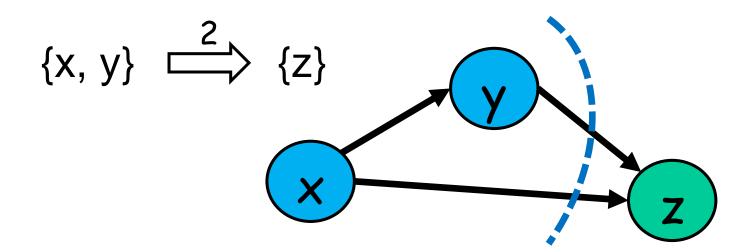
A  $\stackrel{k}{\Longrightarrow}$  B if at least <u>k distinct nodes</u> in set A have links to nodes in set B

$$\{x, y\} \xrightarrow{2} \{z\}$$

### k-propagate

A  $\stackrel{\kappa}{\Longrightarrow}$  B if at least <u>k distinct nodes</u> in set A have links to nodes in set B

Whether set B has enough neighbors from outside?



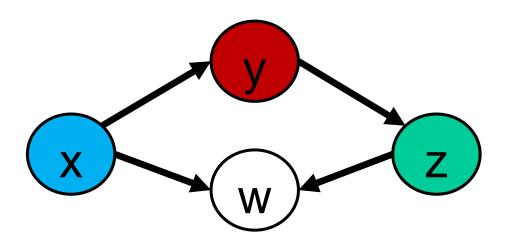


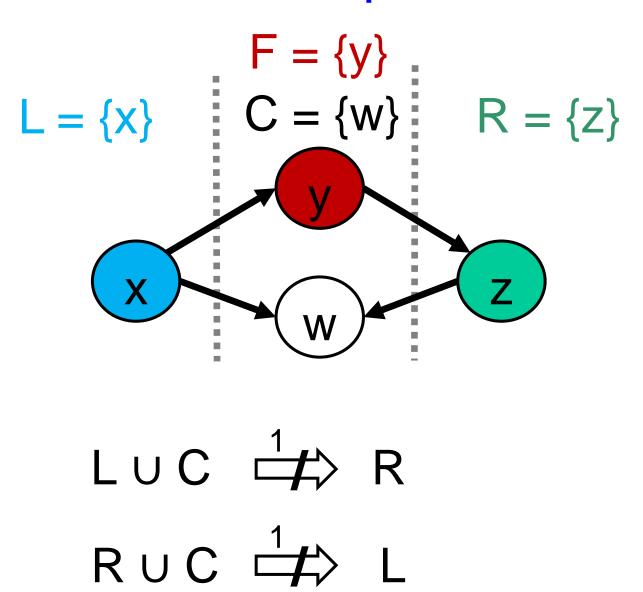
# Crash Failures + Synchrony

Exact consensus possible iff

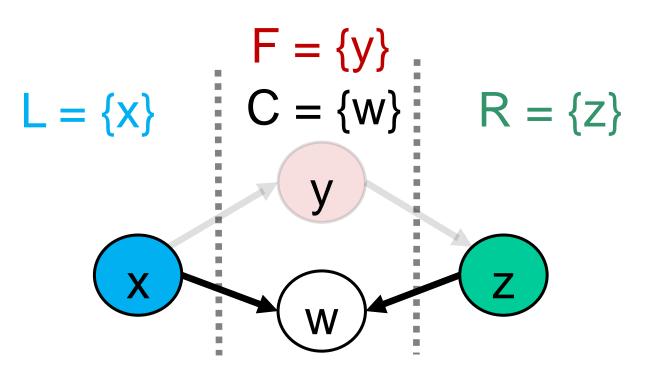
For any node partition L, C, R, F with L, R non-empty and  $|F| \le f$ , L U C  $\stackrel{1}{\Longrightarrow}$  R

or  $R \cup C \stackrel{1}{\Longrightarrow} L$ 









$$L \cup C \stackrel{1}{\Longrightarrow} R$$

$$R \cup C \stackrel{1}{\Longrightarrow} L$$

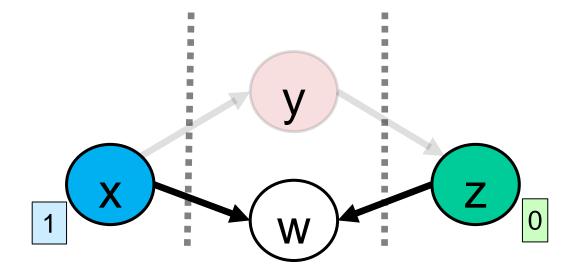
Cannot tolerate

1 crash fault

### **Necessity: Intuition**

If condition is <u>not</u> true,

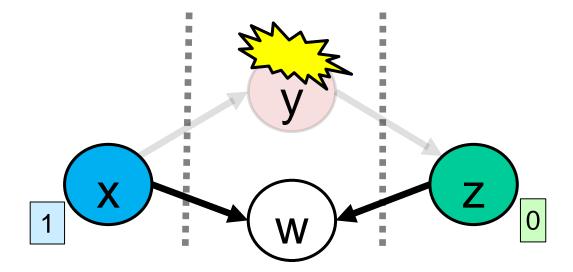
- all removed nodes crash
- two groups of nodes <u>cannot</u> communicate with each other



### **Necessity: Intuition**

If condition is <u>not</u> true,

- all removed nodes crash
- two groups of nodes <u>cannot</u> communicate with each other

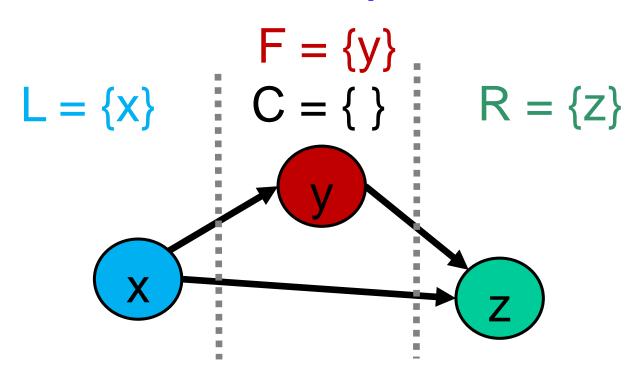




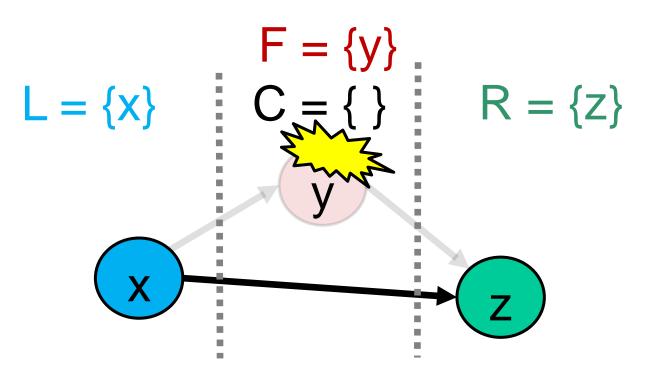
# **Equivalent Condition**

Removing up to f nodes, the remaining graph contains a

directed rooted spanning tree



$$L \cup C \stackrel{1}{\Longrightarrow} R$$

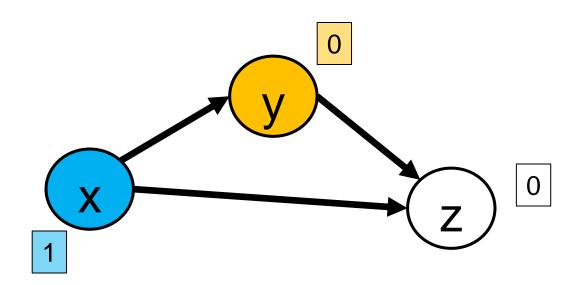


$$L \cup C \stackrel{1}{\Longrightarrow} R$$

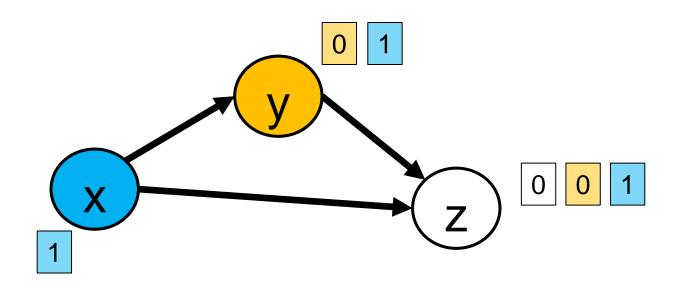
Can tolerate

1 crash fault

Source(s) can propagate its state

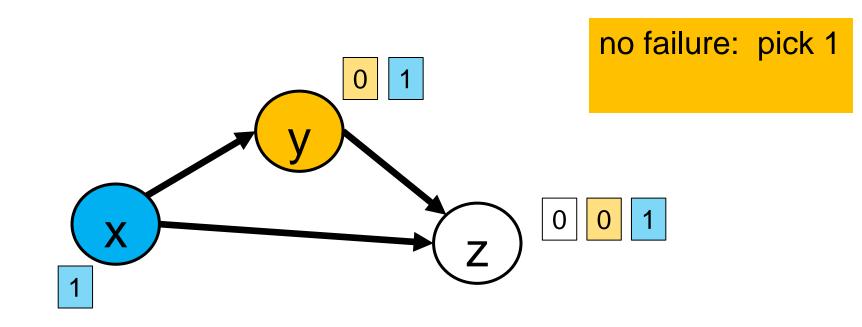


Source(s) can propagate its state



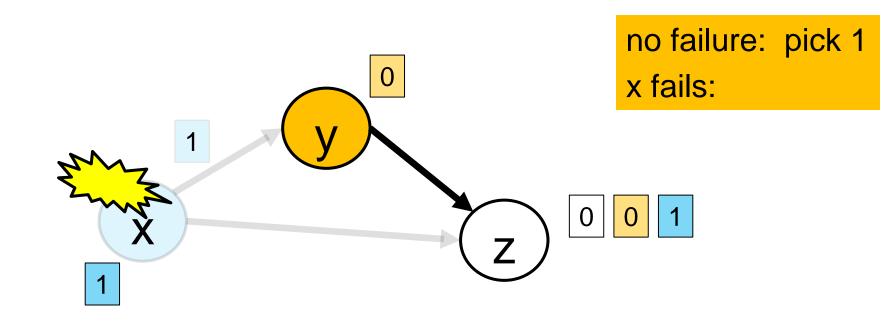
Source(s) can propagate its state

• Which source is fault-free?



Source(s) can propagate its state

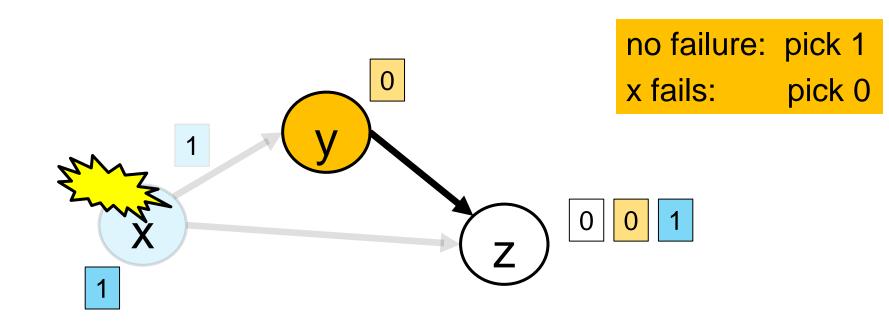
• Which source is fault-free?





Source(s) can propagate its state

• Which source is fault-free?



### Algorithm Min-Max

$$v_i = input$$

binary consensus

```
Phase p = 1 to 2f+2
```

```
Flood v_i
Receive set of values R_i
if p is even
```

$$v_i = min(R_i)$$
 (Min Phase)

else

$$v_i = max(R_i)$$
 (Max Phase)

Output v<sub>i</sub> after 2f+2 phases

### Algorithm Min-Max

binary consensus

```
v_i = input
```

Phase 
$$p = 1$$
 to  $2f+2$ 

```
Flood v<sub>i</sub>
Receive set of values R<sub>i</sub>
```

if p is even

$$v_i = min(R_i)$$

(Min Phase)

else

$$v_i = max(R_i)$$

(Max Phase)

Output v<sub>i</sub> after 2f+2 phases

$$v_i = input$$

Phase 
$$p = 1$$
 to  $2f+2$ 

```
Flood v_i
Receive set of values R_i
if p is even
```

$$v_i = min(R_i)$$
 (Min Phase)

else

$$v_i = max(R_i)$$
 (Max Phase)

$$v_i = input$$

Phase p = 1 to 2f+2

```
Flood v_i

Receive set of values R_i

if p is even

v_i = \min(R_i) (Min Phase)

else

v_i = \max(R_i) (Max Phase)
```

$$v_i = input$$

Phase 
$$p = 1$$
 to  $2f+2$ 

Flood v<sub>i</sub>

Receive set of values Ri

if p is even

$$v_i = min(R_i)$$

else

$$v_i = max(R_i)$$

(Min Phase)

(Max Phase)

$$v_i = input$$

Phase 
$$p = 1$$
 to  $2f+2$ 

Flood v<sub>i</sub>

Receive set of values R<sub>i</sub>

if p is even

$$v_i = min(R_i)$$

(Min Phase)

else

$$v_i = max(R_i)$$

(Max Phase)

$$v_i = input$$

Phase p = 1 to 2f+2

two consecutive fault-free phases

```
Flood v_i

Receive set of values R_i

if p is even

v_i = \min(R_i) (Min Phase)

else

v_i = \max(R_i) (Max Phase)
```

## Sufficiency: Correctness

Two consecutive <u>fault-free</u> phases p and p'
Suppose p = min phase and
p' = max phase

If any <u>source</u> in <u>phase</u> p has 0, then done Otherwise, the source(s) can propagate 1 in phase p'

## Sufficiency: Correctness

Two consecutive <u>fault-free</u> phases p and p'
Suppose p = min phase and
p' = max phase

If any <u>source</u> in <u>phase</u> p has 0, then done Otherwise, the source(s) can propagate 1 in phase p'

Necessary condition:

there exists a directed rooted spanning tree

# Byzantine Failures + Synchrony

## **Exact Byzantine Consensus**

Each node has a binary input

Agreement: Good nodes agree on an

*exact* value

Validity: Agreed value is an input at some good node

Termination



# Byzantine Failures + Synchrony

Exact consensus possible iff

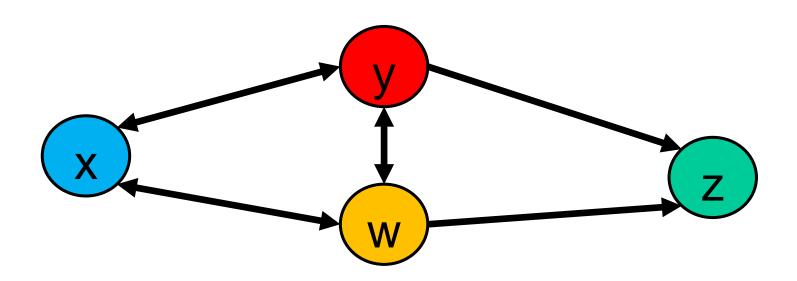
```
For any node partition L, C, R, F with
```

L, R non-empty, and  $|F| \le f$ 

$$L \cup C \stackrel{f+1}{\Longrightarrow} R$$

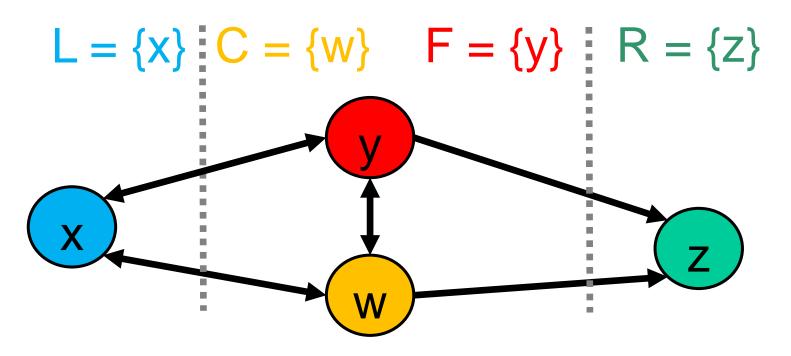
or 
$$R \cup C \xrightarrow{f+1} L$$

# Example



Tolerate 1 crash fault

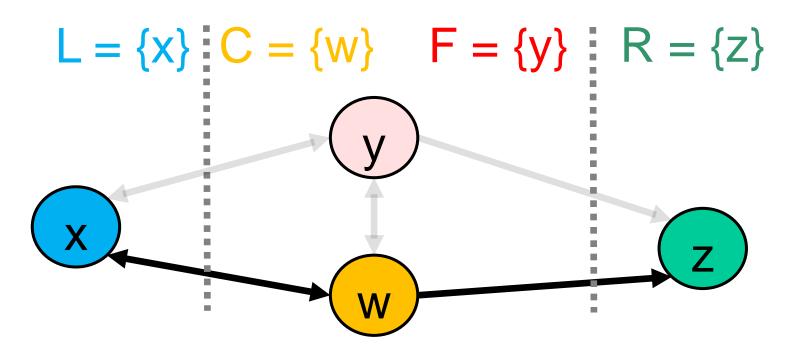
#### Example



$$L \cup C \stackrel{2}{\Longrightarrow} R$$

$$R \cup C \stackrel{2}{\Longrightarrow} L$$

#### Example



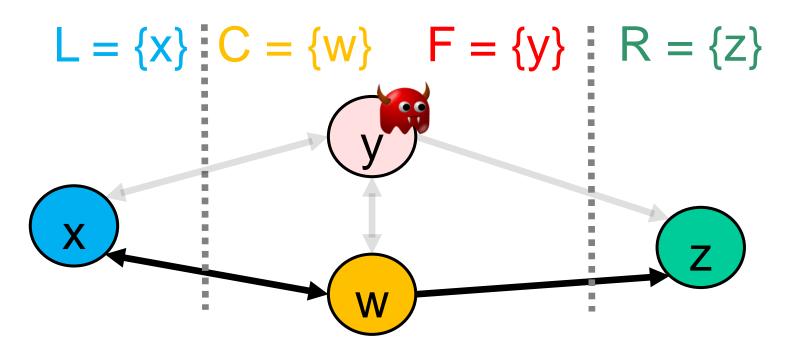
$$L \cup C \stackrel{2}{=} R$$

$$R \cup C \stackrel{2}{\Longrightarrow} L$$

Cannot tolerate

1 Byzantine fault

#### **Necessity: Intuition**



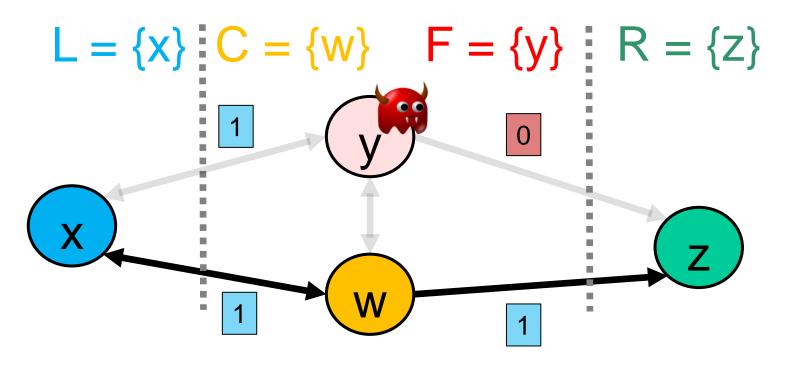
$$L \cup C \stackrel{2}{\Longrightarrow} R$$

$$R \cup C \stackrel{2}{\rightleftharpoons} L$$

Cannot tolerate

1 Byzantine fault

#### **Necessity: Intuition**



- x cannot hear from z
- z cannot receive x's msg <u>reliably</u>

$$L \cup C \stackrel{2}{\rightleftharpoons} R$$

$$R \cup C \stackrel{2}{\Longrightarrow} L$$

Cannot tolerate

1 Byzantine fault

## **Equivalent Condition**

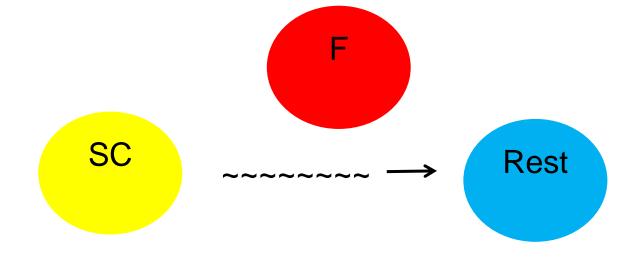
- 1. Remove F  $(|F| \le f)$
- 2. Remove <u>outgoing links</u> of F1 (|F1| ≤ f)

Then, the remaining graph contains a

directed rooted spanning tree

# **Key Properties**

In the graph:



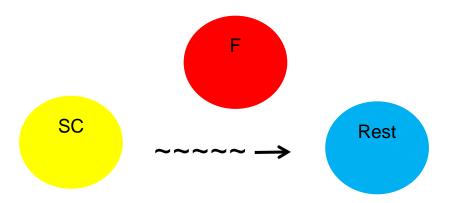
- strongly connected (of size > f)
- f+1 paths excluding F to the rest of the graph

# Sufficiency: Algorithm BC

OUTER Loop: enumerating over all possible F

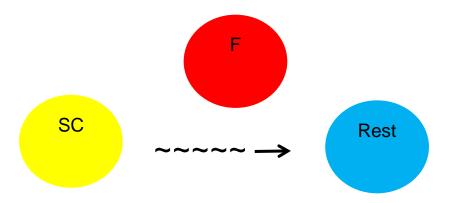
INNER Loop: enumerating over all partitions

## **Propagation**



- SC: using <u>f+1</u> paths excluding F to send values
- Rest: if same received values, state := value

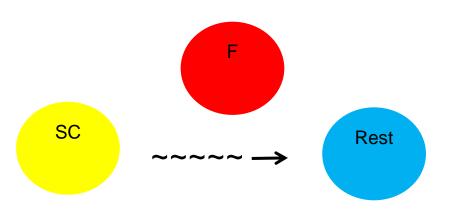
## Propagation



SC: check if states are the same,
 use <u>f+1</u> paths excluding F to send state v

Rest: if same received values, state := value

## Propagation



States stay valid

Agreement is achieved:

- F = actual fault set
- nodes in SC have same state
- SC: check if states are the same,
   use <u>f+1</u> paths excluding F to send state v
- Rest: if same received values,state := value

## Algorithm BC

OUTER Loop: enumerating over all possible F

INNER Loop: enumerating over all partitions

SC

OUTER Loop: enumerating over all possible F

INNER Loop: enumerating over all partitions

# Algorithm BC

Rest

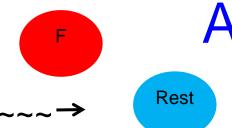
OUTER Loop: enumerating over all possible F

INNER Loop: enumerating over all partitions

Propagation:

SC

values stay valid



# Algorithm BC

F = actual fault set

OUTER Loop: enumerating over all possible F

INNER Loop: enumerating over all partitions

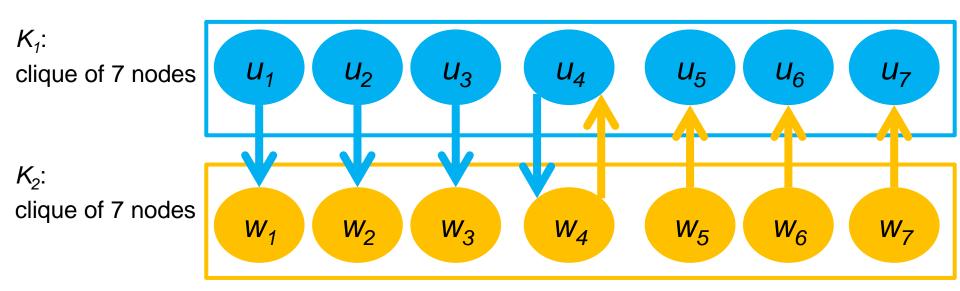
Propagation: values stay valid

SC

SC propagates values

Agreement is achieved when nodes in SC have the same value

## 2-clique Network

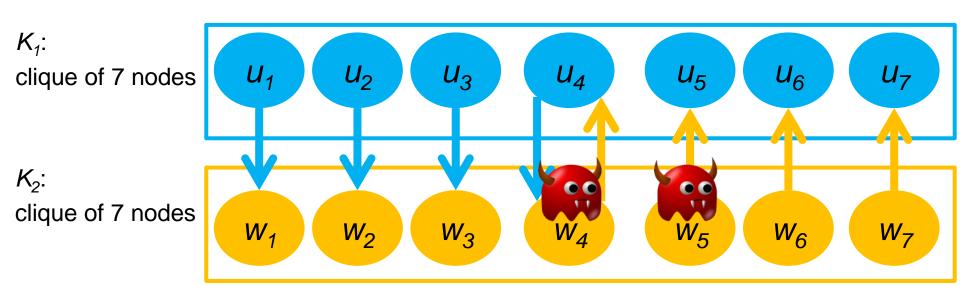


4 directed links in each direction between the cliques

Can tolerate 2
Byzantine faults

#### 2-clique Network

K<sub>1</sub> and K<sub>2</sub> cannot talk reliably with each other?



4 directed links
in each direction
between the cliques

Can tolerate 2
Byzantine faults



#### Consensus

Fault Model	System/Output		Graph	Results
Crash	Synchronous	Exact	Undirected	Well-known Results
			Directed	PODC '15
		Approximate	Undirected	Decentralized Control (e.g., [Tsitsiklis '84]
			Directed	
	Asynchronous		Undirected	[Jadbabaei '03])
			Directed	PODC '15
Byzantine	Synchronous	Exact	Undirected	[PSL '80] [FLM '85]
			Directed	PODC '15
		Approximate	Undirected	[Dolev '83] [FLM '85]
			Directed	PODC '12
	Asynchronous		Undirected	[Dolev '83] [FLM '85]
			Directed	Open

#### Our Other Work

#### Byzantine + Synchronous + Approximate + Iterative:

Fault Model	Results		
up to f failures	[Vaidya, Tseng, Liang, PODC '12]		
Generalized	[Tseng, Vaidya, ICDCN '13]		
Link failures	[Tseng, Vaidya, NETYS '14]		
Mobile faults	[Tseng, SSS '17]		

#### **Byzantine Broadcast:**

- [Tseng, Vaidya, Bhandari, IPL '16], [Tseng NCA '17]

#### **Convex Hull Consensus:**

- [Tseng, Vaidya, PODC '14]

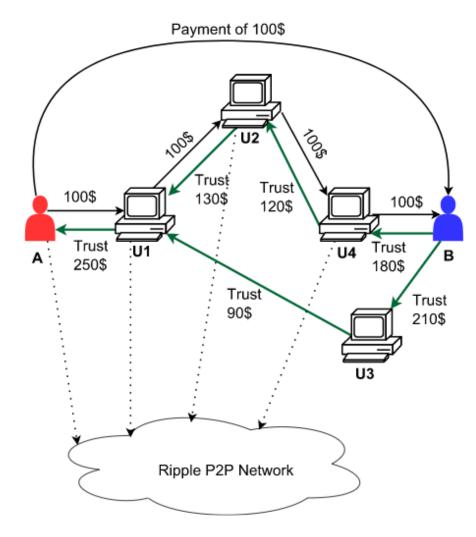
## **Open Problems**

- Graph property for Asynchrony + Byzantine
- More efficient algorithms
- Lower bound on time complexity
- Given G, find the maximum number of faults that can be tolerated

## Open Problems

- Other types of consensus
  - k-consensus
  - different fault models
  - different validity conditions
- Other types of networks
  - time-varying network
  - Different network interpretation, e.g., network of trusts

#### **Network of Trusts**



## Thanks!