

Byzantine Vector Consensus in Complete Graphs

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Assumptions

- Complete graph of n processes
- f Byzantine faults
- Each process has d -dimensional **vector** input

$d = 2$

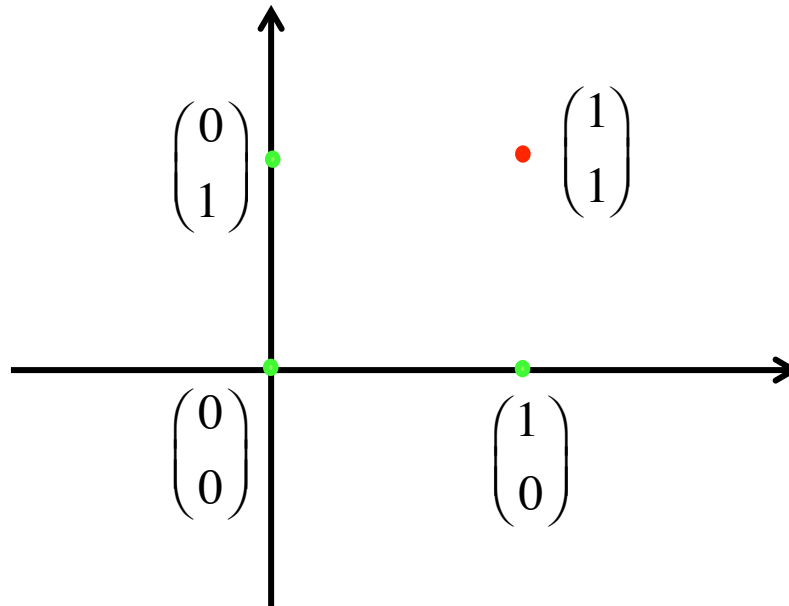
Inputs

$$\begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

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$$\begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

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Exact Vector Consensus

- **Agreement:** Fault-free processes agree *exactly*
- **Validity:** Output vector in convex hull of inputs at fault-free processes
- **Termination:** In finite time

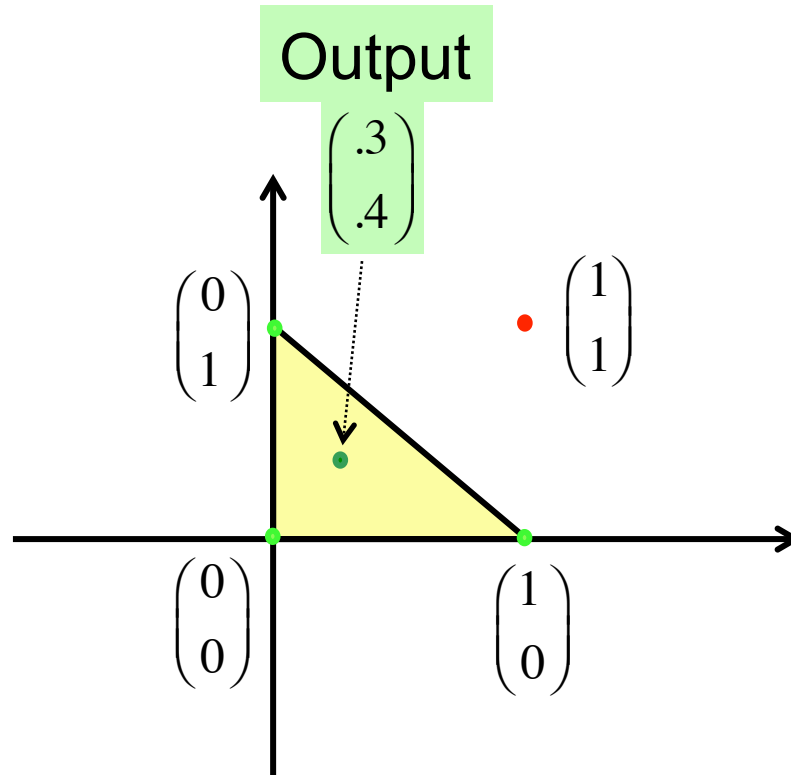
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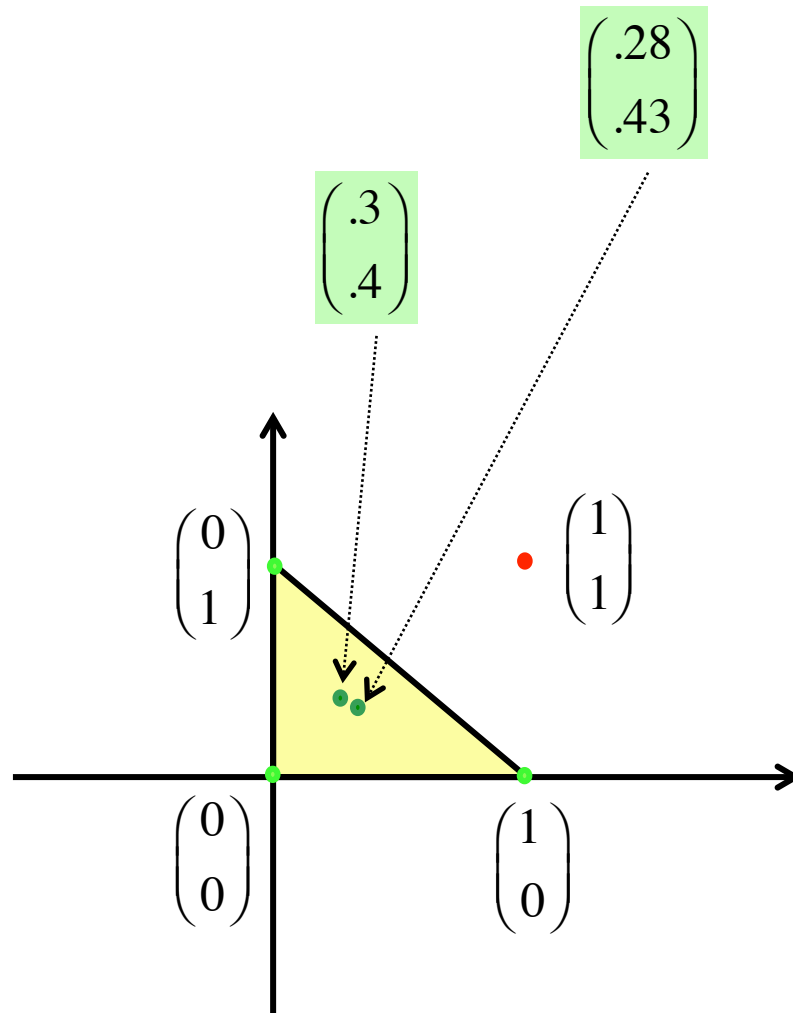
$$\begin{pmatrix} 1 \\ 1 \end{pmatrix}$$



Approximate Vector Consensus

- **ε -Agreement:** output vector elements differ by $\leq \varepsilon$
- **Validity:** Output vector in convex hull of inputs at fault-free processes
- **Termination:** In finite time

$\epsilon = 0.04$



Traditional Consensus Problem

- Special case of vector consensus : $d = 1$
- Necessary & sufficient condition for complete graphs:

$$n \geq 3f + 1$$

in **synchronous** [Lamport, Shostak, Pease]
& **asynchronous** systems [Abraham, Amit, Dolev]

Results

Necessary and Sufficient Conditions (Complete Graphs)

- Exact consensus in **synchronous systems**

$$n \geq \max(3, d+1) f + 1$$

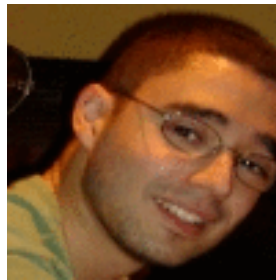
- Approximate consensus in **asynchronous systems**

$$n \geq (d+2) f + 1$$

STOC 2013

Similar results for **asynchronous** systems

Hammurabi Mendes & Maurice Herlihy



Talk Outline

	Necessity	Sufficiency
Synchronous	$\max(3, d+1) f + 1$	$\max(3, d+1) f + 1$
Asynchronous	$(d+2) f + 1$	$(d+2) f + 1$

Synchronous Systems:

$n \geq \max(3, d+1) f + 1$ necessary

- $n \geq 3f + 1$ necessary due to Lamport, Shostak, Pease

Synchronous Systems:

$$n \geq \max(3, d+1) f + 1 \quad \text{necessary}$$

■ $n \geq 3f + 1$ necessary due to Lamport, Shostak, Pease

■ Proof of $n \geq (d+1) f + 1$ by contradiction ...

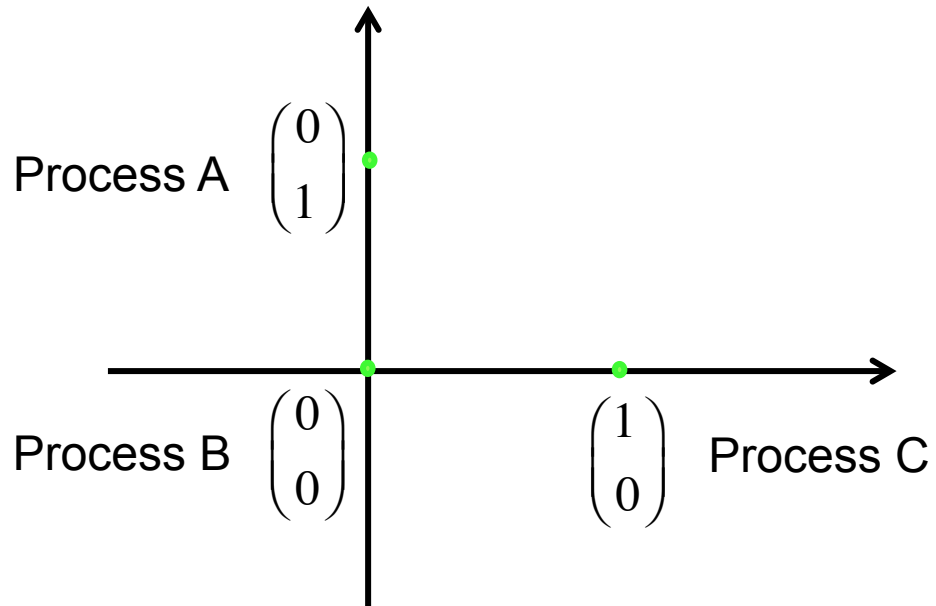
suppose that

$$f = 1$$

$$n \leq (d+1)$$

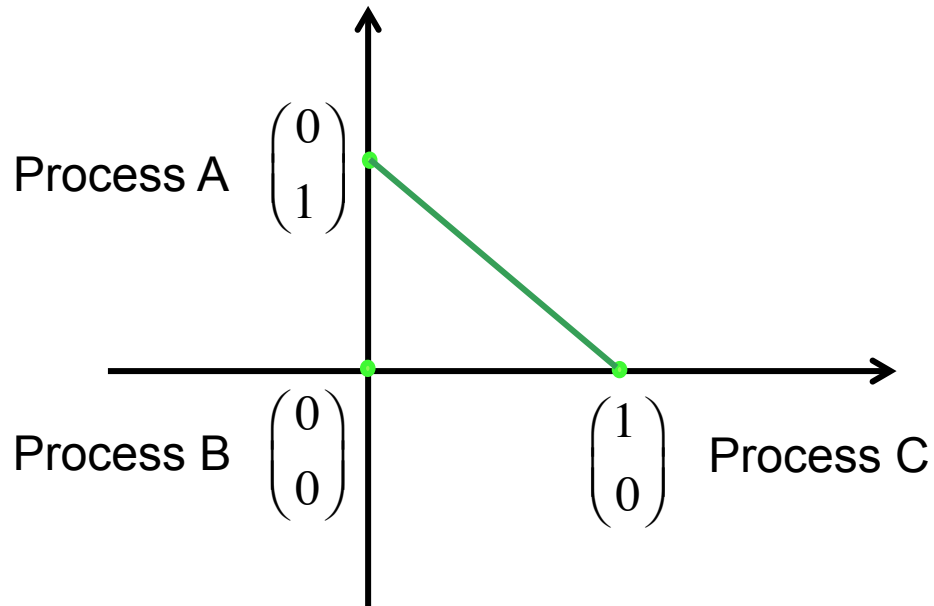
$$n \leq d+1 = 3 \quad \text{when } d = 2$$

- Three fault-free processes, with inputs shown below



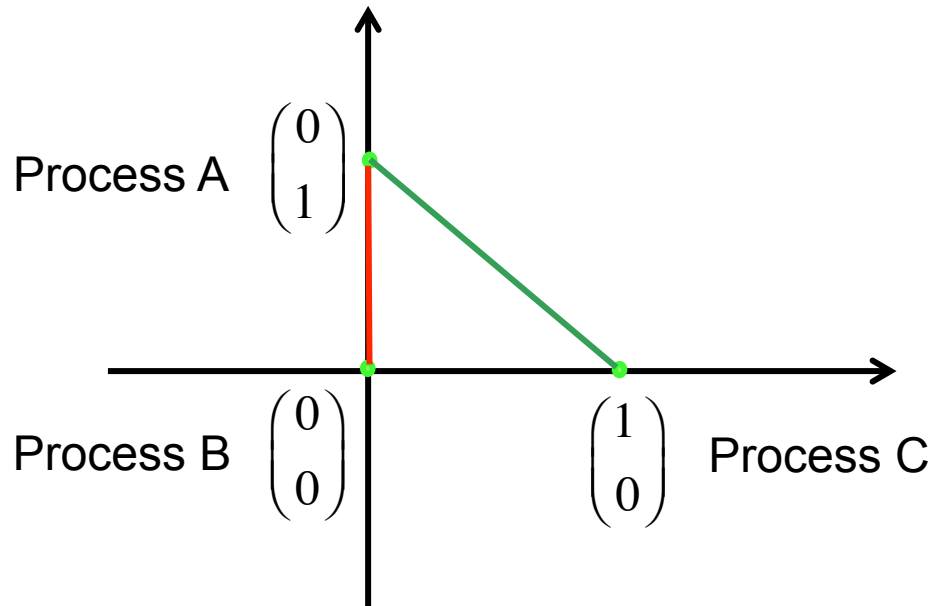
Process A's Viewpoint

- If B faulty : output on green segment (for validity)



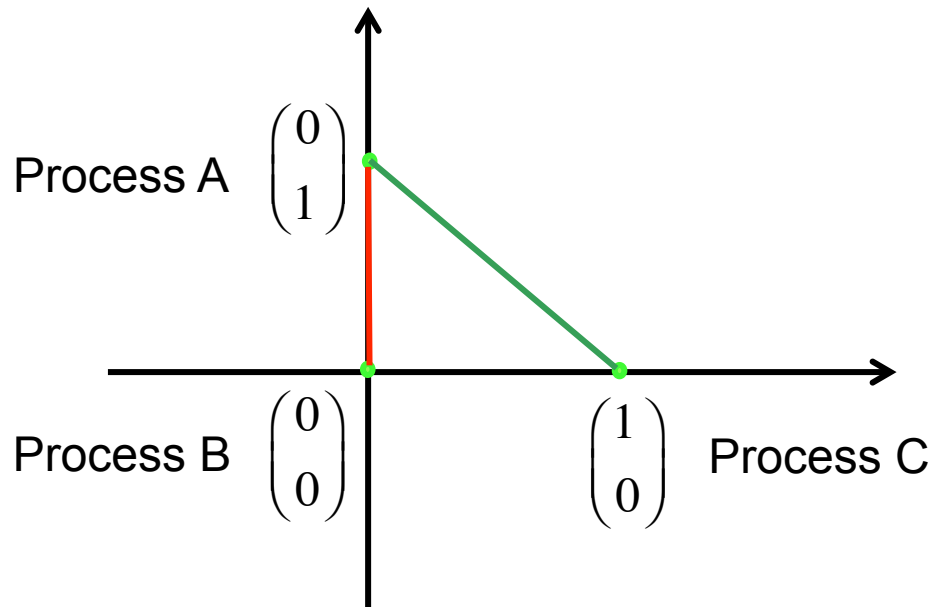
Process A's Viewpoint

- If B faulty : output on **green** segment (for validity)
- If C faulty : output on **red** segment



Process A's Viewpoint

- If B faulty : output on **green** segment (for validity)
 - If C faulty : output on **red** segment
- Output must be on both segments = **initial state**



$$d = 2$$

- Validity forces each process to choose output = own input

→ No agreement

→ $n = (d+1)$ insufficient when $f = 1$

→ By simulation, $(d+1)f$ insufficient

Proof generalizes to all d

Talk Outline

	Necessity	Sufficiency
Synchronous	$\max(3, d+1) f + 1$	$\max(3, d+1) f + 1$
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Synchronous System

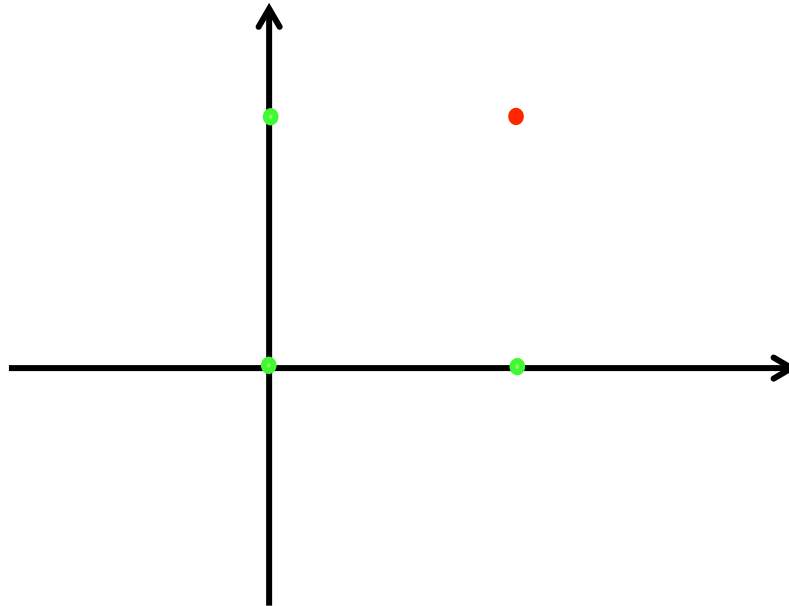
$$n \geq \max(3, d+1) f + 1$$

1. Reliably broadcast input vector to all processes
[Lamport, Shostak, Pease]
2. Receive multiset Y containing n vectors
3. Output = a deterministically chosen point in

$$\Gamma(Y) = \bigcap_{T \subseteq Y, |T|=|Y|-f} \text{Hull}(T)$$

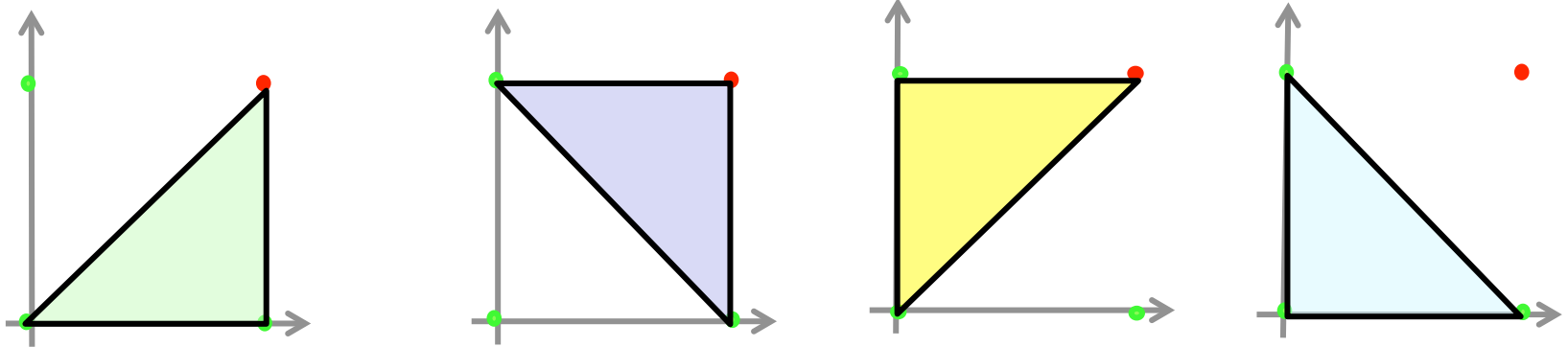
$$d = 2, \quad f = 1, \quad n = 4$$

- Y contains 4 points, one from faulty process



$$n-f = 3$$

- Y contains 4 points, one from faulty process
- Output in intersection of hulls of $(n-f)$ -sets in Y



Proof of Validity

Output in $\Gamma(Y) = \bigcap_{T \subseteq Y, |T|=|Y|-f} \text{Hull}(T)$

- **Claim 1** : Intersection is non-empty
- **Claim 2** : All points in intersection are in convex hull of fault-free inputs

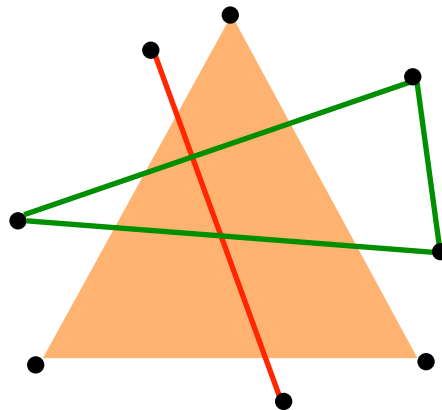
Tverberg's Theorem

$\geq (d+1)f+1$ points can be partitioned into $(f+1)$ sets such that their convex hulls intersect

$$d = 2$$

$$f = 2$$

$$n = 8$$



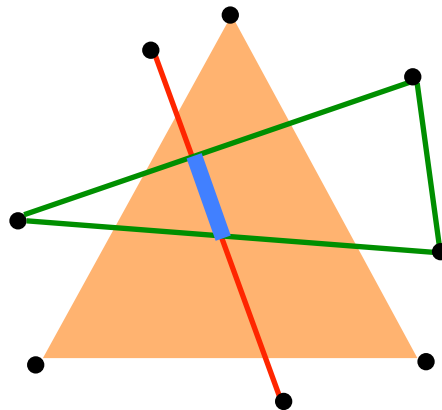
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Tverberg points

Claim 1: Intersection is Non-Empty

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- Each T contains one set in Tverberg partition of Y
- ➔ Intersection contains all Tverberg points of Y
- ➔ Non-empty by Tverberg theorem when $\geq (d+1)f+1$

Claim 2:

Intersection in Convex Hull of Fault-Free Inputs

$$\Gamma(Y) = \bigcap_{T \subseteq Y, |T|=|Y|-f} \text{Hull}(T)$$

- At least one T contains inputs of only fault-free processes

→ Claim 2

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Asynchronous System

$n \geq (d+2) f + 1$ is Necessary

- Suppose $f=1$, $n=d+2$
- One process very slow
... remaining $d+1$ must terminate on their own
- $d+1$ processes choose output = own input
(as in synchronous case)

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Asynchronous System

$$n \geq (d+2) f + 1$$

- Algorithm executes in asynchronous rounds
- Process i computes $v_i[t]$ in its round t
- Initialization: $v_i[0] = \text{input vector}$

Asynchronous System

$$n \geq (d+2) f + 1$$

- Algorithm executes in asynchronous rounds
- Process i computes $v_i[t]$ in its round t
- **Initialization:** $v_i[0]$ = input vector

... 2 steps per round

Step 1 in Round t

- Reliably broadcast state $v_i[t-1]$
- Primitive from [Abraham, Amit, Dolev] ensures that
each pair of fault-free processes receives
($n-f$) identical messages

Step 2 in Round t

- Process i receives multiset B_i of vectors in step 1

$$|B_i| \geq n-f$$

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- New state $v_i[t] = \text{average over these points}$

Validity

- $|B_i| \geq n-f$

$n \geq (d+2)f + 1 \rightarrow n-f \geq (d+1)f + 1 \rightarrow$ Tverberg applies

- Validity proof similar to synchronous

ε -Agreement

Recall from Step 2

- For each $(n-f)$ -subset Y of B_i ... choose a point in $\Gamma(Y)$
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Because i and j receive identical $n-f$ messages in step 1, they choose at least **one** identical point above

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$$\mathbf{v}_i[t] = \sum \alpha_k \mathbf{v}_k[t-1]$$

$$\mathbf{v}_j[t] = \sum \beta_k \mathbf{v}_k[t-1]$$

$\mathbf{v}_i[t]$ and $\mathbf{v}_j[t]$ as
convex combination
of fault-free states,
with non-zero weight
for an identical process

ε -Agreement

$$\mathbf{v}_i[t] = \sum \alpha_k \mathbf{v}_k[t - 1]$$

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Rest of the argument standard in convergence proofs

ε -Agreement

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Rest of the argument standard in convergence proofs

→ Range of each vector element shrinks by a factor < 1 in each round

→ ε -Agreement after sufficient number of rounds

Summary

- Necessary and sufficient n for vector consensus
- Synchronous & asynchronous systems

Matrix Form

$$\mathbf{v}_i[t] = \sum \alpha_k \mathbf{v}_k[t-1]$$

$\mathbf{v}_i[t]$ and $\mathbf{v}_j[t]$ as
convex combination
of fault-free states,

$$\mathbf{v}_j[t] = \sum \beta_k \mathbf{v}_k[t-1]$$

with non-zero weight
for an identical process

$$\mathbf{v}[t] = M[t] \mathbf{v}[t-1] \quad \text{where } M[t] \text{ is row stochastic with}$$

a coefficient of ergodicity < 1

Matrix Form

$$\mathbf{v}_i[t] = \sum \alpha_k \mathbf{v}_k[t-1]$$

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$\mathbf{v}_i[t]$ and $\mathbf{v}_j[t]$ as convex combination of fault-free states, with non-zero weight for an identical process

$\mathbf{v}[t] = M[t] \mathbf{v}[t-1]$ where $M[t]$ is row stochastic with a coefficient of ergodicity < 1

→ Consensus **because** $\prod M[t]$ has a limit with identical rows

Hajnal 1957

Wolfowitz 1963

Matrix Form

- Popular tool in decentralized control literature on *fault-free* iterative consensus [Tsitsiklis,Jadbabaei]
- Allows derivation of stronger results
 - Incomplete graphs
 - Time-varying graphs

Thanks!

Exact Consensus

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Exact Consensus

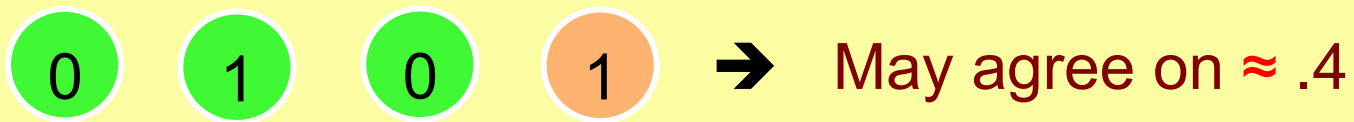
Impossible with asynchrony [FLP]

Approximate Consensus

- **Agreement:** Fault-free processes agree *approximately*
- **Validity:** ...
- **Termination:** ...

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Necessary & Sufficient Condition (Complete Graphs)

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for

- Exact consensus with synchrony
- Approximate consensus with asynchrony

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with scalar inputs

