# Parameterized Model Checking of Fault-tolerant Distributed Algorithms by Abstraction

Annu John Igor Konnov Ulrich Schmid Helmut Veith Josef Widder





FMCAD'13 Portland, OR, USA, Oct 20-23, 2013

# Why fault-tolerant (FT) distributed algorithms

#### faults not in the control of system designer

- bit-flips in memory
- power outage
- disconnection from the network
- intruders take control over some computers





# Why fault-tolerant (FT) distributed algorithms

#### faults not in the control of system designer

- bit-flips in memory
- power outage
- disconnection from the network
- intruders take control over some computers

# distributed algorithms intended to make systems more reliable even in the presence of faults

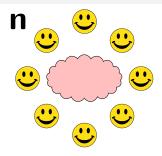
- replicate processes
- exchange messages
- do coordinated computation
- goal: keep replicated processes in "good state"





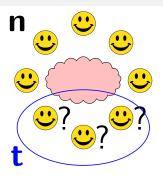


# Fault-tolerant distributed algorithms



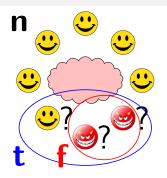
• n processes communicate by messages

# Fault-tolerant distributed algorithms



- *n* processes communicate by messages
- ullet all processes know that at most t of them might be faulty

# Fault-tolerant distributed algorithms



- *n* processes communicate by messages
- all processes know that at most t of them might be faulty
- f are actually faulty
- resilience conditions, e.g.,  $n > 3t \land t \ge f \ge 0$
- no masquerading: the processes know the origin of incoming messages

# Fault models from benign to Byzantine

clean crashes:
 faulty processes prematurely halt after/before "send to all"

crash faults:
 faulty processes prematurely halt (also) in the middle of "send to all"

 omission faults:
 faulty processes follow the algorithm, but some messages sent by them might be lost

 symmetric faults: faulty processes send arbitrarily to all or nobody

 Byzantine faults: faulty processes can do anything

hybrid models:
 combinations of the above

# **Automated Verification?**

# Fault-tolerant DAs: Model Checking Challenges

- unbounded data types
   counting how many messages have been received
- parameterization in multiple parameters among n processes  $f \le t$  are faulty with n > 3t
- contrast to concurrent programs
   fault tolerance against adverse environments
- degrees of concurrency
   many degrees of partial synchrony
- continuous time fault-tolerant clock synchronization

# Importance of liveness in distributed algorithms

Interplay of safety and liveness is a central challenge in DAs

- interplay of safety and liveness is non-trivial
- asynchrony and faults lead to impossibility results

# Importance of liveness in distributed algorithms

Interplay of safety and liveness is a central challenge in DAs

- interplay of safety and liveness is non-trivial
- asynchrony and faults lead to impossibility results

Rich literature to verify safety (e.g. in concurrent systems)

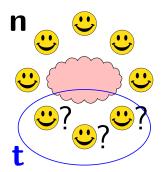
Distributed algorithms perspective:

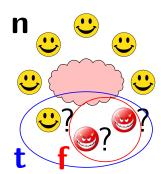
- "doing nothing is always safe"
- "tools verify algorithms that actually might do nothing"

# Model checking problem for fault-tolerant DA algorithms

#### Parameterized model checking problem:

- ullet given a distributed algorithm and spec. arphi
- show for all n, t, and f satisfying  $n > 3t \land t \ge f \ge 0$   $M(n, t, f) \models \varphi$
- every M(n, t, f) is a system of n f correct processes

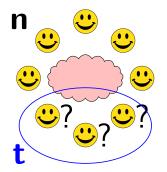


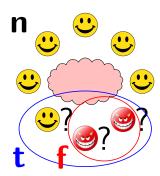


# Model checking problem for fault-tolerant DA algorithms

#### Parameterized model checking problem:

- ullet given a distributed algorithm and spec.  $\varphi$
- show for all n, t, and f satisfying  $M(n, t, f) \models \varphi$
- every M(n, t, f) is a system of N(n, f) correct processes





# Properties in Linear Temporal Logic

Unforgeability (U). If  $v_i = 0$  for all correct processes i, then for all correct processes j, accept i remains 0 forever.

$$\mathbf{G}\left(ig(igwedge_{i=1}^{n-f} v_i = 0ig) 
ightarrow \mathbf{G}\left(igwedge_{j=1}^{n-f} \mathit{accept}_j = 0
ight)
ight)$$

Completeness (C). If  $v_i = 1$  for all correct processes i, then there is a correct process j that eventually sets accept i to 1.

$$\mathbf{G}\left(ig(igwedge_{i=1}^{n-f} \mathsf{v}_i = 1ig) 
ightarrow \mathbf{F}\left(igvee_{j=1}^{n-f} \mathsf{accept}_j = 1
ight)
ight)$$

Relay (R). If a correct process i sets accept $_i$  to 1, then eventually all correct processes j set accept $_i$  to 1.

$$\mathbf{G}\left(ig(igvee_{i=1}^{n-f}\mathit{accept}_i=1ig)
ightarrow\mathbf{F}\left(igwedge_{j=1}^{n-f}\mathit{accept}_j=1ig)
ight)$$

# Properties in Linear Temporal Logic

Unforgeability (U). If  $v_i = 0$  for all correct processes i, then for all correct processes j, accept j remains 0 forever.

$$\mathbf{G}\left(ig(igwedge_{i=1}^{n-f} v_i = 0ig) 
ightarrow \mathbf{G}\left(igwedge_{i=1}^{n-f} accept_j = 0ig)
ight)$$
 Safety

Completeness (C). If  $v_i = 1$  for all correct processes i, then there is a correct process j that eventually sets accept i to 1.

$$\mathbf{G}\left(\left(igwedge_{i=1}^{n-f} v_i = 1
ight) 
ightarrow \mathbf{F}\left(igvee_{j=1}^{n-f} accept_j = 1
ight)
ight)$$
 Liveness

Relay (R). If a correct process i sets accept, to 1, then eventually all correct processes j set accept, to 1.

$$\mathbf{G}\left(\left(igvee_{i=1}^{n-f} \mathit{accept}_i = 1
ight) 
ightarrow \mathbf{F}\left(igwedge_{j=1}^{n-f} \mathit{accept}_j = 1
ight)
ight)$$
 Liveness

# Threshold-guarded fault-tolerant distributed algorithms

# Threshold-guarded FTDAs

#### Fault-free construct: quantified guards (t=f=0)

- Existential Guardif received m from some process then ...
- Universal Guard
   if received m from all processes then ...

These guards allow one to treat the processes in a parameterized way

# Threshold-guarded FTDAs

#### Fault-free construct: quantified guards (t=f=0)

- Existential Guardif received m from some process then ...
- Universal Guard if received *m* from *all* processes then ...

These guards allow one to treat the processes in a parameterized way

what if faults might occur?



# Threshold-guarded FTDAs

#### Fault-free construct: quantified guards (t=f=0)

- Existential Guardif received m from some process then ...
- Universal Guard if received *m* from *all* processes then ...

These guards allow one to treat the processes in a parameterized way

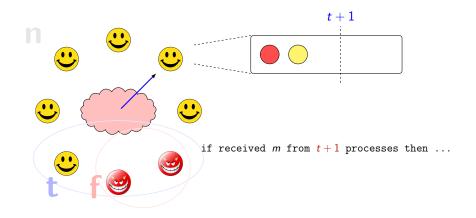
what if faults might occur?



#### Fault-Tolerant Algorithms: n processes, at most t are Byzantine

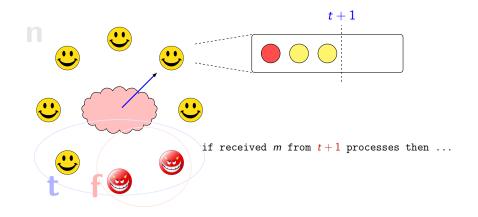
- Threshold Guard if received m from n-t processes then ...
- (the processes cannot refer to f!)

# Counting argument in threshold-guarded algorithms



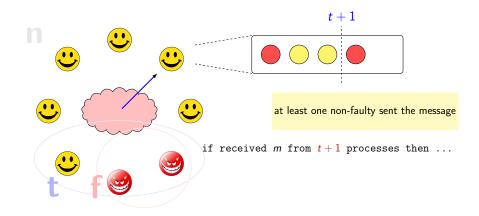
Correct processes count distinct incoming messages

# Counting argument in threshold-guarded algorithms



Correct processes count distinct incoming messages

# Counting argument in threshold-guarded algorithms



Correct processes count distinct incoming messages

# our abstraction at a glance

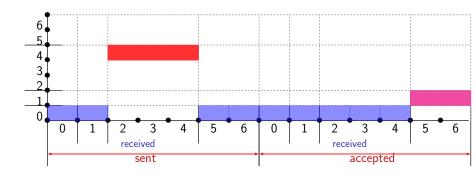
$$n=6,\ t=1,\ f=1$$
 
$$t+1=2,\ n-t=5$$
 1 process at (accepted, received=5) 
$$\frac{6}{5} \frac{5}{4} \frac{1}{3} \frac{1}{2} \frac{1}{2} \frac{1}{2} \frac{1}{2} \frac{1}{3} \frac{1}{4} \frac{1}{5} \frac{1}{6} \frac{1}{6} \frac{1}{6} \frac{1}{2} \frac{1}{3} \frac{1}{4} \frac{1}{5} \frac{1}{6} \frac{1}{$$

sent

accepted

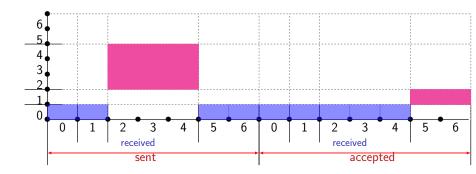
$$n = 6$$
,  $t = 1$ ,  $f = 1$ 

$$t + 1 = 2$$
,  $n - t = 5$ 



$$n = 6$$
,  $t = 1$ ,  $f = 1$ 

$$t + 1 = 2$$
,  $n - t = 5$ 



$$n=6, t=1, t=1$$

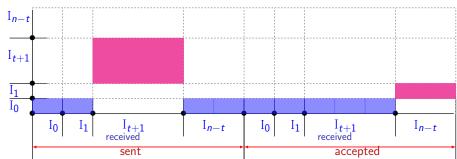
$$n > 3 \cdot t \wedge t > f$$

#### Parametric intervals:

$$I_0 = [0, 1)$$
  $I_1 = [1, t + 1)$ 

$$\mathbf{I}_{t+1} = [t+1, n-t)$$

$$I_{n-t}=[n-t,\infty)$$



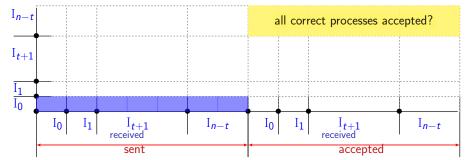
#### Parametric intervals:

$$n > 3 \cdot t \wedge t > f$$

$$I_0 = [0,1)$$
  $I_1 = [1, t+1)$ 

$$I_{t+1} = [t+1, n-t)$$

$$I_{n-t}=[n-t,\infty)$$



# Related work: $(0,1,\infty)$ -counter abstraction

Pnueli, Xu, and Zuck (2001) introduced  $(0,1,\infty)$ -counter abstraction:

- finitely many local states,
   e.g., {N, T, C}.
- abstract the number of processes in every state,

e.g., 
$$K: C \mapsto \mathbf{0}, T \mapsto \mathbf{1}, N \mapsto$$
 "many".

perfectly reflects mutual exclusion properties

e.g., 
$$G(K(C) = 0 \lor K(C) = 1)$$
.

# Related work: $(0,1,\infty)$ -counter abstraction

Pnueli, Xu, and Zuck (2001) introduced  $(0, 1, \infty)$ -counter abstraction:

- finitely many local states,
   e.g., {N, T, C}.
- abstract the number of processes in every state,

e.g., 
$$K: C \mapsto \mathbf{0}, T \mapsto \mathbf{1}, N \mapsto$$
 "many".

perfectly reflects mutual exclusion properties

e.g., 
$$G(K(C) = 0 \lor K(C) = 1)$$
.

#### Our parametric data + counter abstraction:

- unboundendly many local states (nr. of received messages)
- finer counting of processes:
  - t+1 processes in a specific state can force global progress, while t processes cannot
- mapping t, t+1, and n-t to "many" is too coarse.

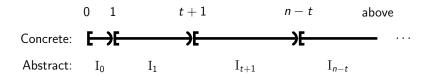
# Technical details

# Technical challenges

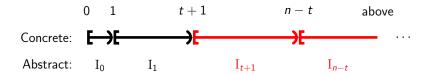
How to do data abstraction?

How to do counter abstraction?

How to refine spurious counter-examples introduced by the abstraction?



Concrete 
$$t + 1 \le x$$



Concrete 
$$t + 1 \le x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ .

Concrete 
$$t + 1 \le x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ .

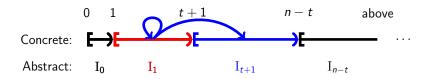
Concrete 
$$x' = x + 1$$
,

Concrete: 
$$I_0$$
  $I_1$   $I_{t+1}$   $I_{n-t}$  above ...

Concrete 
$$t + 1 \le x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ .

Concrete 
$$x' = x + 1$$
, is abstracted as:  
 $x = I_0 \quad \land \quad x' = I_1 \dots$ 

### Abstract operations



Concrete 
$$t + 1 \le x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ .

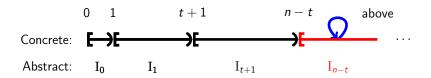
Concrete 
$$x' = x + 1$$
, is abstracted as: 
$$\begin{aligned} x &= I_0 & \wedge & x' &= I_1 \\ \vee x &= I_1 & \wedge & \left( x' &= I_1 & \vee x' &= I_{t+1} \right) \ldots \end{aligned}$$

## Abstract operations

Concrete 
$$t + 1 \le x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ .

Concrete 
$$x'=x+1$$
, is abstracted as: 
$$\begin{aligned} x &= I_0 & \wedge & x' &= I_1 \\ \forall x &= I_1 & \wedge & (x'=I_1 & \vee & x' &= I_{t+1}) \\ \forall x &= I_{t+1} \wedge & (x'=I_{t+1} \vee & x' &= I_{n-t}) \dots \end{aligned}$$

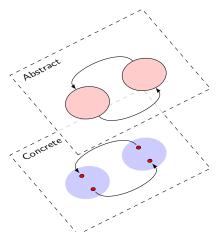
## Abstract operations



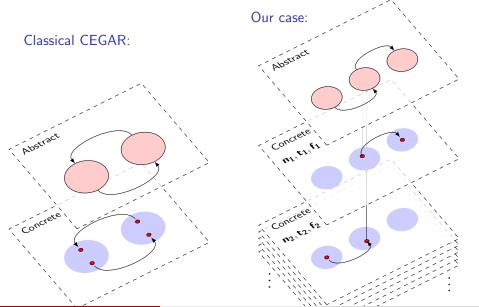
Concrete 
$$t+1 \leq x$$
 is abstracted as  $x = I_{t+1} \lor x = I_{n-t}$ . Concrete  $x' = x+1$ , is abstracted as: 
$$x = I_0 \quad \land \quad x' = I_1 \\ \lor x = I_1 \quad \land (x' = I_1 \quad \lor x' = I_{t+1}) \\ \lor x = I_{t+1} \land (x' = I_{t+1} \lor x' = I_{n-t}) \\ \lor x = I_{n-t} \land \quad x' = I_{n-t}$$

# Parametric abst. refinement — uniformly spurious paths

#### Classical CEGAR:

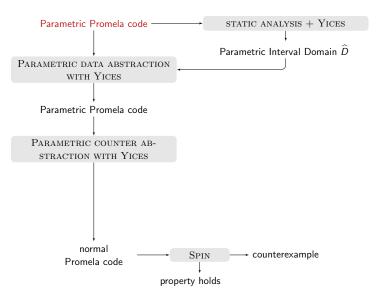


# Parametric abst. refinement — uniformly spurious paths

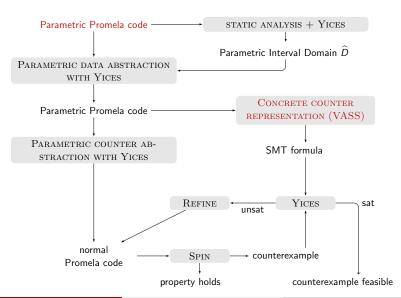


# the implementation

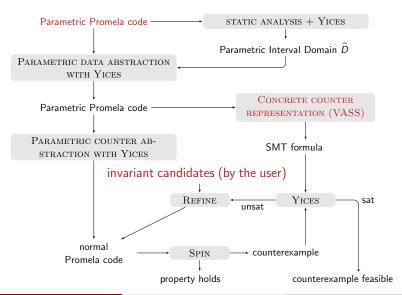
#### Tool Chain: BYMC



#### Tool Chain: BYMC

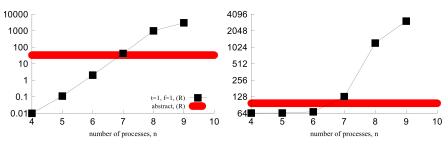


#### Tool Chain: BYMC



## Concrete vs. parameterized (Byzantine case)

Time to check relay (sec, logscale) Memory to check relay (MB, logscale)



- Parameterized model checking performs well (the red line).
- Experiments for fixed parameters quickly degrade (n = 9 runs out of memory).
- We found counter-examples for the cases n = 3t and f > t, where the resilience condition is violated.

## Experimental results at a glance

Algorithm	Fault	Resilience	Property	Valid?	#Refinements	Time
ST87	Byz	n > 3t	U	✓	0	4 sec.
ST87	Byz	n > 3t	C	✓	10	32 sec.
ST87	Byz	n > 3t	R	✓	10	24 sec.
ST87	Symm	n > 2t	U	✓	0	1 sec.
ST87	Symm	n > 2t	C	✓	2	3 sec.
ST87	Symm	n > 2t	R	✓	12	16 sec.
ST87	Оміт	n > 2t	U	1	0	1 sec.
ST87	Omit	n > 2t	C	✓	5	6 sec.
ST87	Omit	n > 2t	R	✓	5	10 sec.
ST87	CLEAN	n > t	U	1	0	2 sec.
ST87	CLEAN	n > t	C	✓	4	8 sec.
ST87	CLEAN	n > t	R	✓	13	31 sec.
CT96	CLEAN	n > t	U	✓	0	1 sec.
CT96	CLEAN	n > t	Α	✓	0	1 sec.
CT96	CLEAN	n > t	R	✓	0	1 sec.
CT96	CLEAN	n > t	С	X	0	1 sec.

# When resilience condition is wrong...

Algorithm	Fault	Resilience	Property	Valid?	#Refinements	Time
ST87	Byz	$n > 3t \land f \le t+1$	U	X	9	56 sec.
ST87	Byz	$n > 3t \wedge f \leq t+1$	C	X	11	52 sec.
ST87	Byz	$n > 3t \wedge f \leq t+1$	R	X	10	17 sec.
ST87	Byz	$n \geq 3t \wedge f \leq t$	U	1	0	5 sec.
ST87	Byz	$n \geq 3t \wedge f \leq t$	C	✓	9	32 sec.
ST87	Byz	$n \geq 3t \wedge f \leq t$	R	X	30	78 sec.
ST87	Symm	$n > 2t \wedge f \leq t+1$	U	Х	0	2 sec.
ST87	Symm	$n > 2t \wedge f \leq t+1$	C	X	2	4 sec.
ST87	Symm	$n > 2t \wedge f \leq t+1$	R	✓	8	12 sec.
ST87	Оміт	$n > 2t \wedge f \leq t$	U	✓	0	1 sec.
ST87	Omit	$n > 2t \wedge f \leq t$	C	X	0	2 sec.
ST87	Оміт	$n > 2t \wedge f \leq t$	R	Х	0	2 sec.

## Experimental setup







The tool (source code in OCaml), the code of the distributed algorithms in Parametric Promela, and a virtual machine with full setup

are available at: http://forsyte.at/software/bymc

## Summary of results

- Abstraction tailored for distributed algorithms
  - threshold-based
  - fault-tolerant
  - allows to express different fault assumptions
- Verification of threshold-based fault-tolerant algorithms
  - with threshold guards that are widely used
  - Byzantine faults (and other)
  - for all system sizes

## Summary of results

- Abstraction tailored for distributed algorithms
  - threshold-based
  - fault-tolerant
  - allows to express different fault assumptions
- Verification of threshold-based fault-tolerant algorithms
  - with threshold guards that are widely used
  - Byzantine faults (and other)
  - for all system sizes

### Related work: non-parameterized

#### Model checking of the small size instances:

clock synchronization

[Steiner, Rushby, Sorea, Pfeifer 2004]

consensus

[Tsuchiya, Schiper 2011]

 asynchronous agreement, folklore broadcast, condition-based consensus [John, Konnov, Schmid, Veith, Widder 2013]

and more...

## Related work: parameterized case

Regular model checking of fault-tolerant distributed protocols:

[Fisman, Kupferman, Lustig 2008]

- "First-shot" theoretical framework.
- No guards like  $x \ge t + 1$ , only  $x \ge 1$ .
- No implementation.
- Manual analysis applied to folklore broadcast (crash faults).

## Related work: parameterized case

Regular model checking of fault-tolerant distributed protocols:

[Fisman, Kupferman, Lustig 2008]

- "First-shot" theoretical framework.
- No guards like  $x \ge t + 1$ , only  $x \ge 1$ .
- No implementation.
- Manual analysis applied to folklore broadcast (crash faults).

#### Backward reachability using SMT with arrays:

[Alberti, Ghilardi, Pagani, Ranise, Rossi 2010-2012]

- Implementation.
- Experiments on Chandra-Toueg 1990.
- No resilience conditions like n > 3t.
- Safety only.

#### Our current work

Discrete synchronous

Discrete partially synchronous

Discrete asynchronous

Continuous synchronous

Continuous partially synchronous

one-shot broadcast, c.b.consensus

core of {ST87,

BT87, CT96},

MA06 (common),

MR04 (binary)

One instance/ finite payload

Many inst./ finite payload

Many inst./ unbounded

payload

reals

Messages with

## Future work: threshold guards + orthogonal features

Discrete synchronous

Discrete partially synchronous

Discrete asynchronous

Continuous synchronous

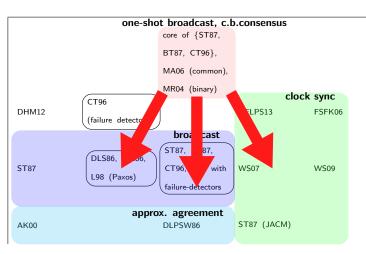
Continuous partially synchronous

One instance/ finite payload

Many inst./
finite payload

Many inst./ unbounded payload

Messages with



# Thank you!

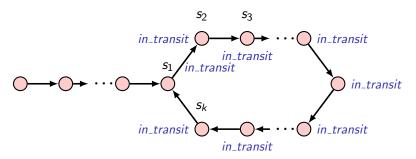
http://forsyte.at/software/bymc

## Fairness, Refinement, and Invariants

- In the Byzantine case we have  $in\_transit : \forall i. (recv_i \geq sent)$  and  $\mathbf{G} \mathbf{F} \neg in\_transit$ .
- In this case communication fairness implies computation fairness.
- But in the abstract version sent can deviate from the number of processes who sent the echo message.
- In this case the user formulates a simple state invariant candidate, e.g.,  $sent = K([sv = SE \lor sv = AC])$  (on the level of the original concrete system).
- The tool checks automatically, whether the candidate is actually a state invariant.
- After the abstraction the abstract version of the invariant restricts the behavior of the abstract transition system.

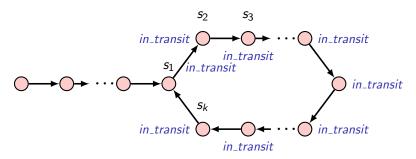
justice **GF** ¬*in\_transit* necessary to verify liveness

justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

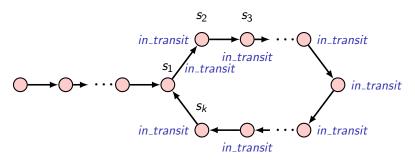
justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

refine justice to 
$$\mathbf{G} \mathbf{F} \neg in\_transit \wedge \mathbf{G} \mathbf{F} \left( \bigvee_{1 \leq j \leq k} \neg at(s_j) \right)$$

justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



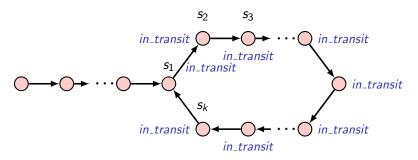
if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

refine justice to 
$$\mathbf{G}\,\mathbf{F}\,\neg in\_transit \,\wedge\, \mathbf{G}\,\mathbf{F} \left(\bigvee_{1\leq j\leq k} \neg at(s_j)\right)$$

... we use unsat cores to refine several loops at once

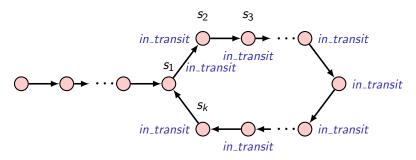
justice **GF** ¬*in\_transit* necessary to verify liveness

justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

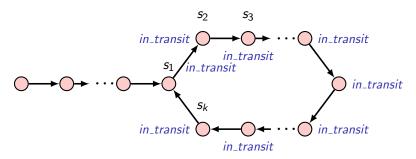
justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

refine justice to 
$$\mathbf{G} \mathbf{F} \neg in\_transit \wedge \mathbf{G} \mathbf{F} \left( \bigvee_{1 \leq j \leq k} \neg at(s_j) \right)$$

justice  $GF \neg in\_transit$  necessary to verify liveness counter example:



if  $\forall j$  all concretizations of  $s_i$  violate  $\neg in\_transit$ , then CE is spurious.

refine justice to 
$$\mathbf{G}\,\mathbf{F}\,\neg in\_transit \,\wedge\, \mathbf{G}\,\mathbf{F} \left(\bigvee_{1\leq j\leq k} \neg at(s_j)\right)$$

... we use unsat cores to refine several loops at once

# asynchronous reliable broadcast (srikanth & toueg 1987)

the core of the classic broadcast algorithm from the da literature. it solves an agreement problem depending on the inputs  $v_i$ .

```
Variables of process i
 v_i: {0, 1} init with 0 or 1
 accept_i: \{0, 1\}  init with 0
An indivisible step:
 if v_i = 1
 then send (echo) to all;
 if received (echo) from at least
   t + 1 distinct processes
   and not sent (echo) before
 then send (echo) to all;
 if received (echo) from at least
   n - t distinct processes
 then accept_i := 1:
```

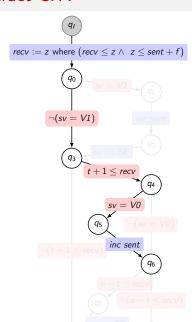
# asynchronous reliable broadcast (srikanth & toueg 1987)

the core of the classic broadcast algorithm from the da literature. it solves an agreement problem depending on the inputs  $v_i$ .

Variables of process i

```
v_i: {0, 1} init with 0 or 1
 accept_i: \{0, 1\}  init with 0
                                                             asynchronous
An indivisible step:
 if v_i = 1
                                                         t byzantine faults
 then send (echo) to all;
 if received (echo) from at least
   t + 1 distinct processes
                                                           correct if n > 3t
   and not sent (echo) before
                                                     resilience condition rc
 then send (echo) to all;
 if received (echo) from at least
   n - t distinct processes
                                                      parameterized process
 then accept_i := 1;
                                                           skeleton p(n, t)
  Igor Konnov (www.forsyte.at)
                         Parameterized Model Checking of FTDAs...
                                                              FMCAD'13
```

#### Abstract CFA



#### Abstract CFA

