

# Synthesis and Control: a Distributed Perspective

Anca Muscholl

LaBRI Bordeaux and TUM-IAS Munich

joint work with I. Walukiewicz

---

# Motivation

---

## Computing paradigms

### High performance

multi-core processors

mobile systems, robots,...

### Data: intrinsically distributed

cloud

## Concurrent programs

### Hard to write...

shared data dependencies

synchronization side-effects

### ... and to verify

corner-case errors, testing has low coverage

traditional exploration: too many interleavings

---

# Motivation

---

Error-free programs are rare...

**Error recovery:** accept the reality

Monitoring = knowledge for recovery

Control = recovery from bad states

---

# Motivation

---

Specific challenges for concurrent programs:

states are **distributed**

error recovery (strategy) must be **distributed**

Question: what is “**distributed**”?

This talk:

Mazurkiewicz trace theory:

A mathematical framework for  
distributed monitoring and control

---

# Outline

---

- ❖ Motivating examples
- ❖ Mazurkiewicz traces
- ❖ Distributed monitoring
- ❖ Distributed control
- ❖ Conclusions

---

# Programs

---

Multi-threaded programs with shared variables:

$r(T,x)$       thread T **reads** variable x

$w(T,x)$       thread T **writes** variable x

Synchronization **operations**:

Locks or atomic read/writes, e.g. CAS = compare-and-swap

---

# Questions

---

*97% of concurrency bugs (not counting deadlocks):*

Learning from mistakes - a comprehensive study on real world concurrency bug characteristics [Lu et al., ASPLOS'08]

**Order violations:** unintended order between threads  
e.g. **race conditions**

**Atomicity violations:** interference from other threads

# Races

unprotected access to shared data

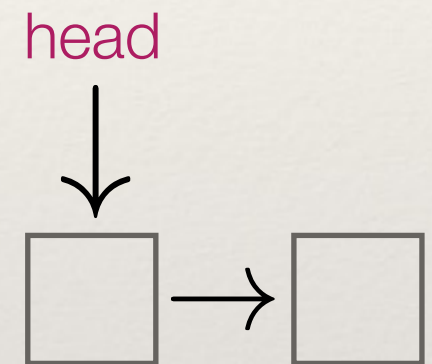
```
type list {int data; list *next}  
list *head
```

Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5:  head = t1  
6: rel(lock)
```

Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



# Races

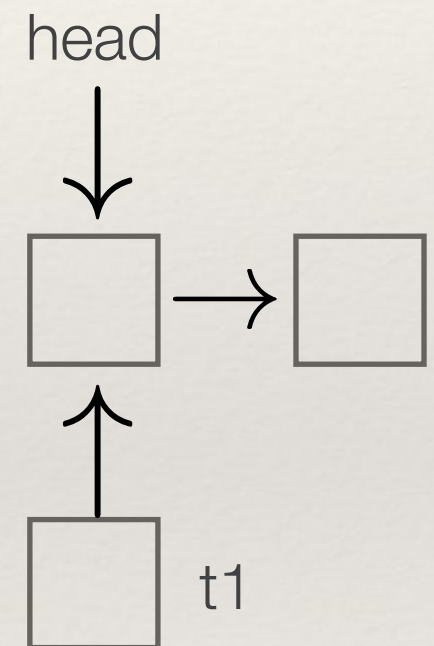
```
type list {int data; list *next}  
list *head
```

Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5: head = t1  
6: rel(lock)
```

Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



# Races

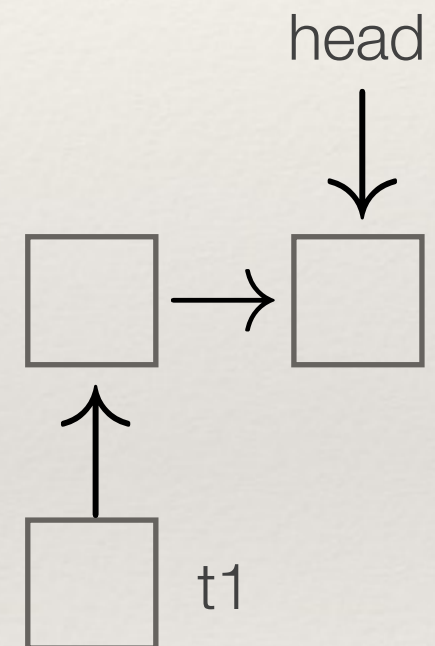
```
type list {int data; list *next}  
list *head
```

Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5: head = t1  
6: rel(lock)
```

Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



# Races

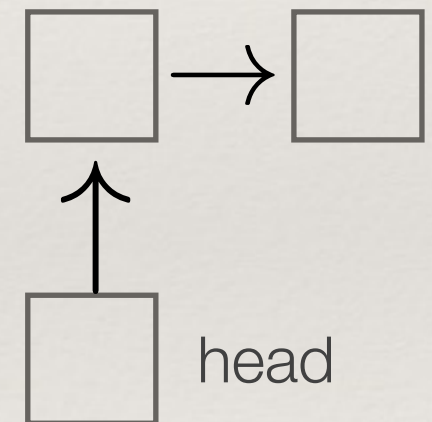
```
type list {int data; list *next}  
list *head
```

Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5:  head = t1  
6: rel(lock)
```

Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



delete failed

# What are races?

## Happens-before order [Lamport, 1978]

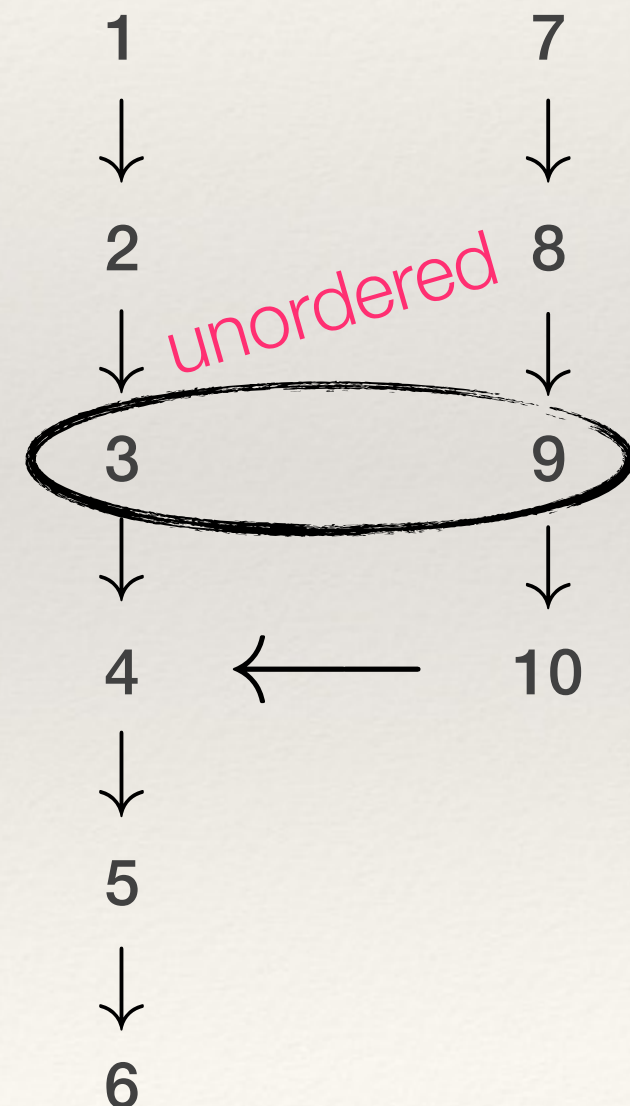
```
type list {int data; list *next}  
list *head
```

Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5: head = t1  
6: rel(lock)
```

Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



---

# Outline

---

- ❖ Motivating examples
- ❖ Mazurkiewicz traces
- ❖ Monitoring
- ❖ Control
- ❖ Conclusions



# Traces

[Mazurkiewicz 1977]

Finite alphabet of actions  $\Sigma$

Conflict relation  $D \subseteq \Sigma \times \Sigma$  (symmetric)

Word

total order  $\leq$

$$a_1 a_2 \cdots a_n$$

$$1 < 2 < \cdots < n$$



Trace

partial order  $\prec^*$

$$i \prec j \quad \text{iff} \quad i < j$$

and  $a_i, a_j$  in conflict

# Traces

```
type list {int data; list *next}  
list *head
```

## Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5: head = t1  
6: rel(lock)
```

## Thread 2

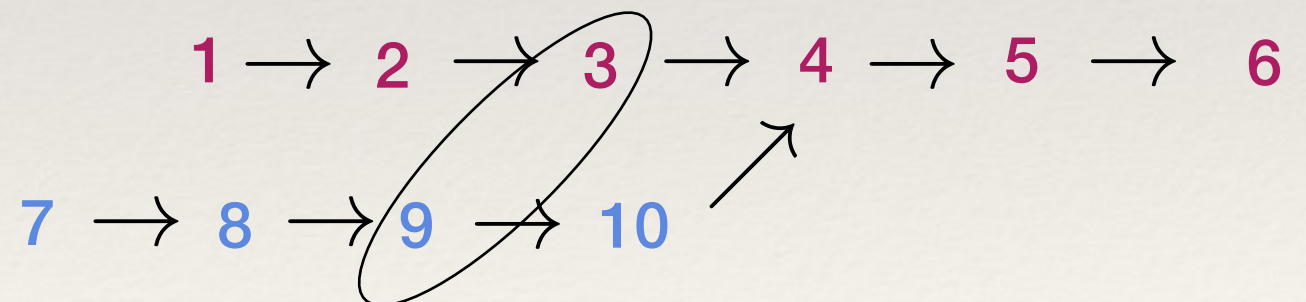
```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```

## Word (total order)

1 2 3 7 8 9 10 4 5 6

1 2 7 8 9 3 10 4 5 6

## Trace (partial order)



**Conflict:** same thread **race** or same lock

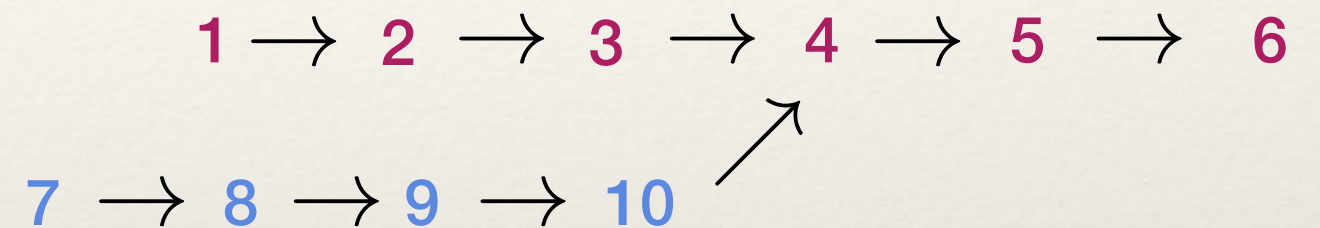
# Traces

Word (total order)

1 2 3 7 8 9 10 4 5 6

1 2 7 8 9 3 10 4 5 6

Trace (partial order)



Trace language:

all linearizations of a set of **trace** partial orders

=

**word** language closed under  $ab = ba$  ,

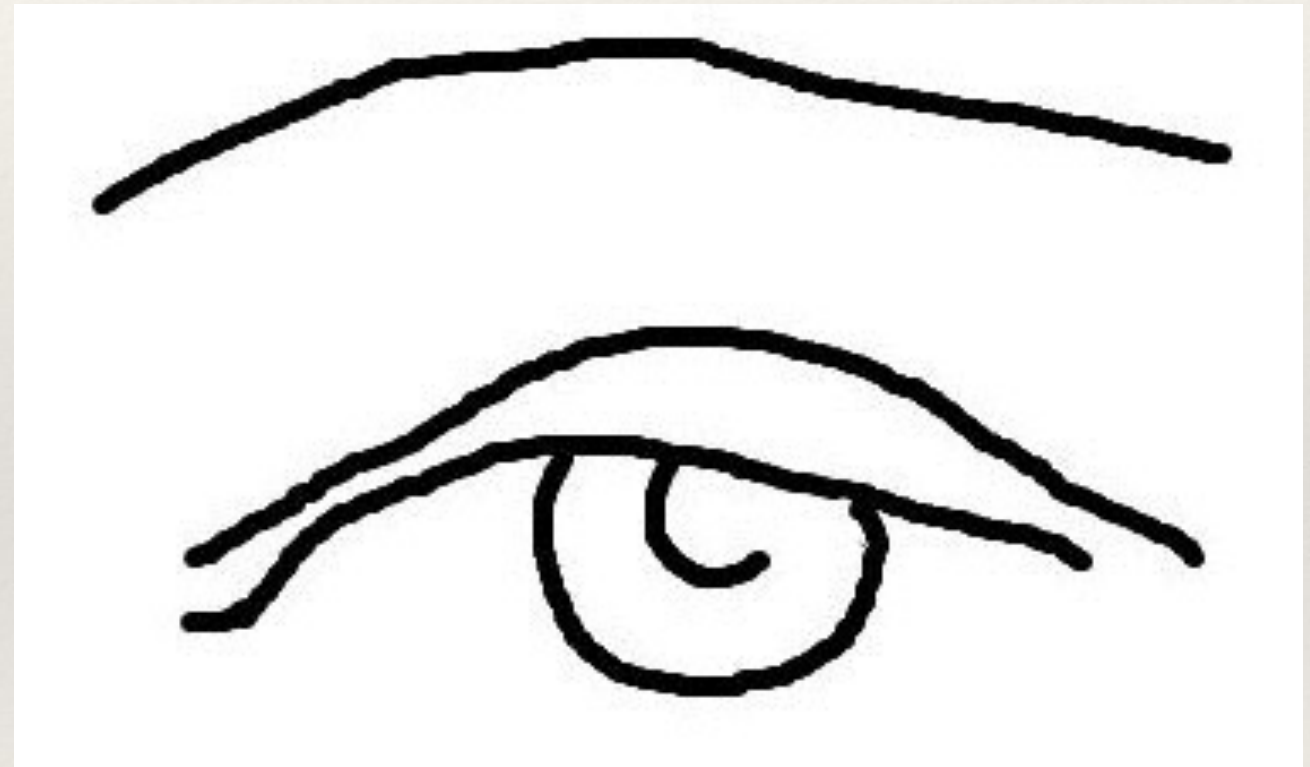
$a, b$  **not** in conflict

---

# Outline

---

- ❖ Motivating examples
- ❖ Mazurkiewicz traces
- ❖ Distributed monitoring
- ❖ Distributed control
- ❖ Conclusions



---

# Monitors

---

- ❖ Synthesis of monitors

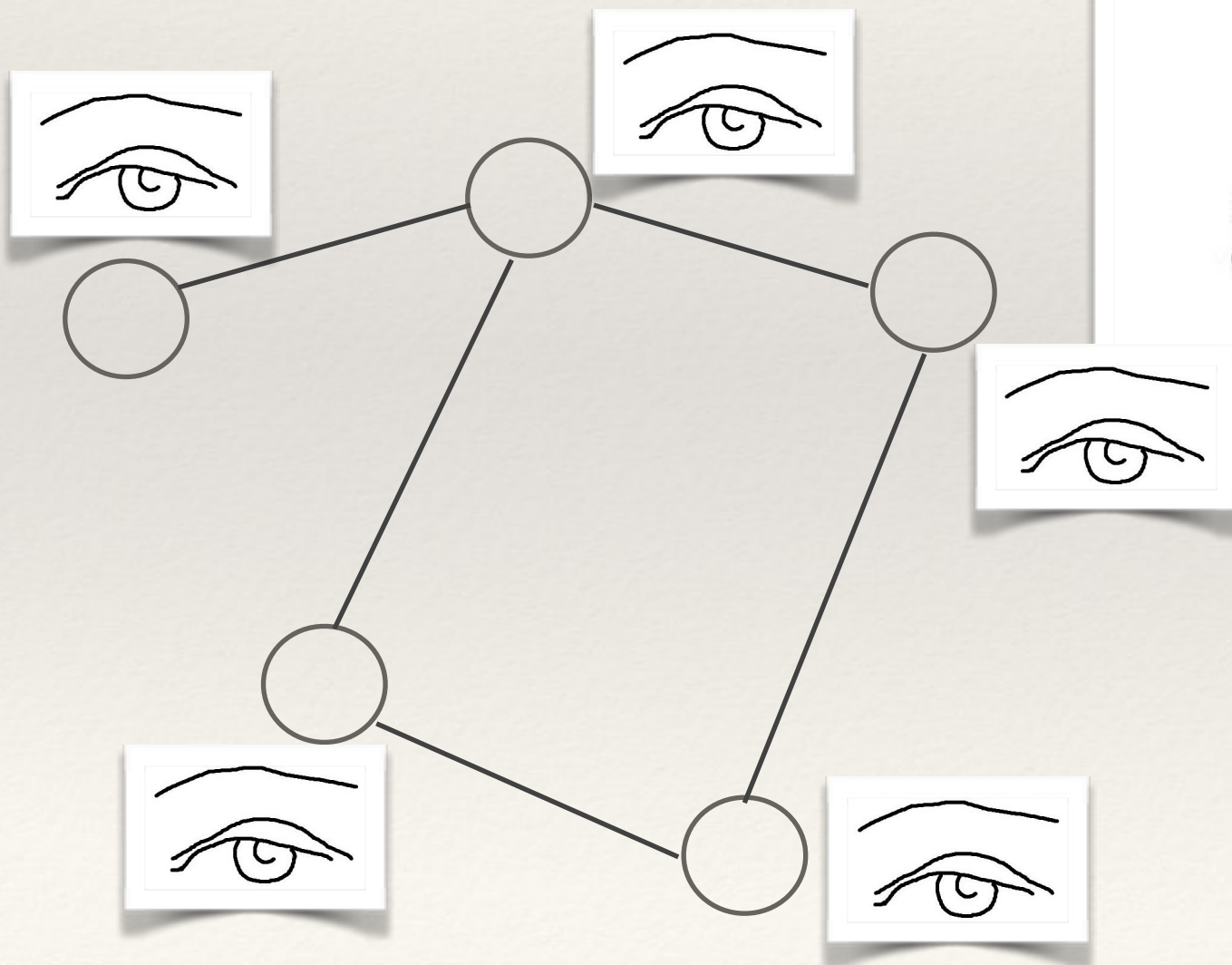
turn a property into a monitor that should detect possible violations at runtime

- ❖ From monitoring to control

monitor information towards error recovery

# Monitoring

Centralized?

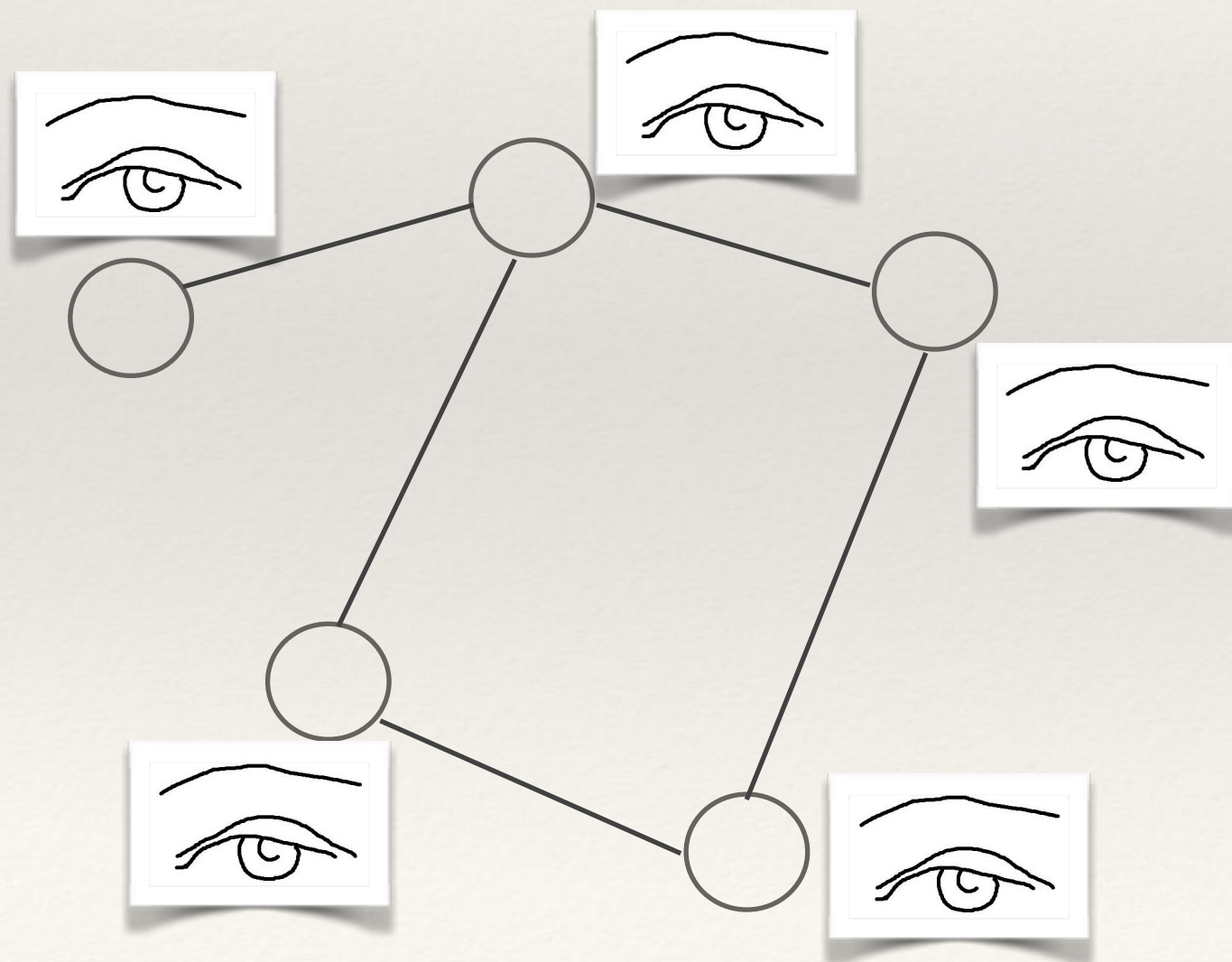


Decentralized?



# Monitoring

Decentralized!



no global synchronization  
required

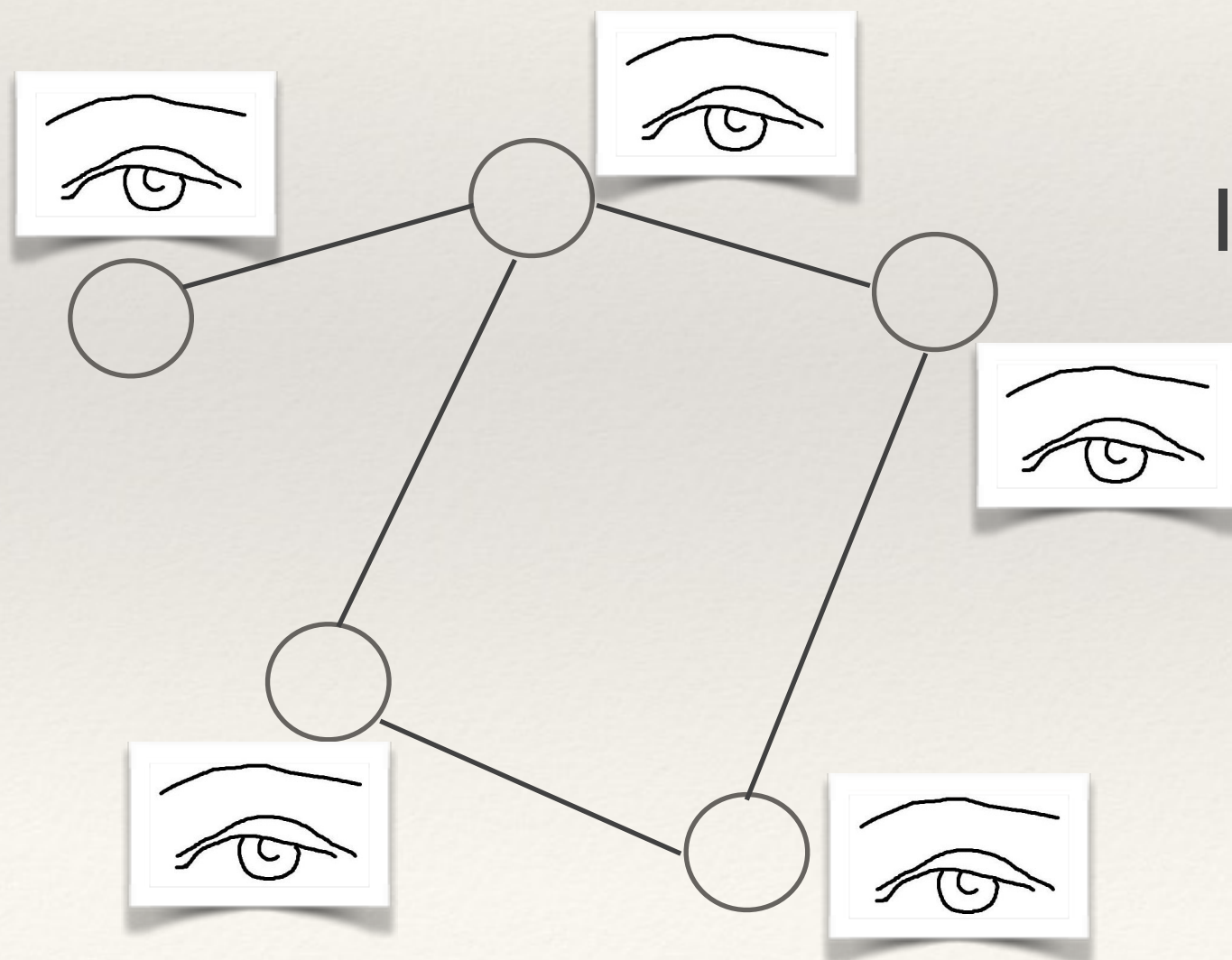
localized failure detection  
and recovery: more efficient

# Monitoring

## Synchronization

between local monitors?

It depends on the architecture



- ❖ communication channels
- ❖ **shared memory**

# Monitors with shared memory: Zielonka automata



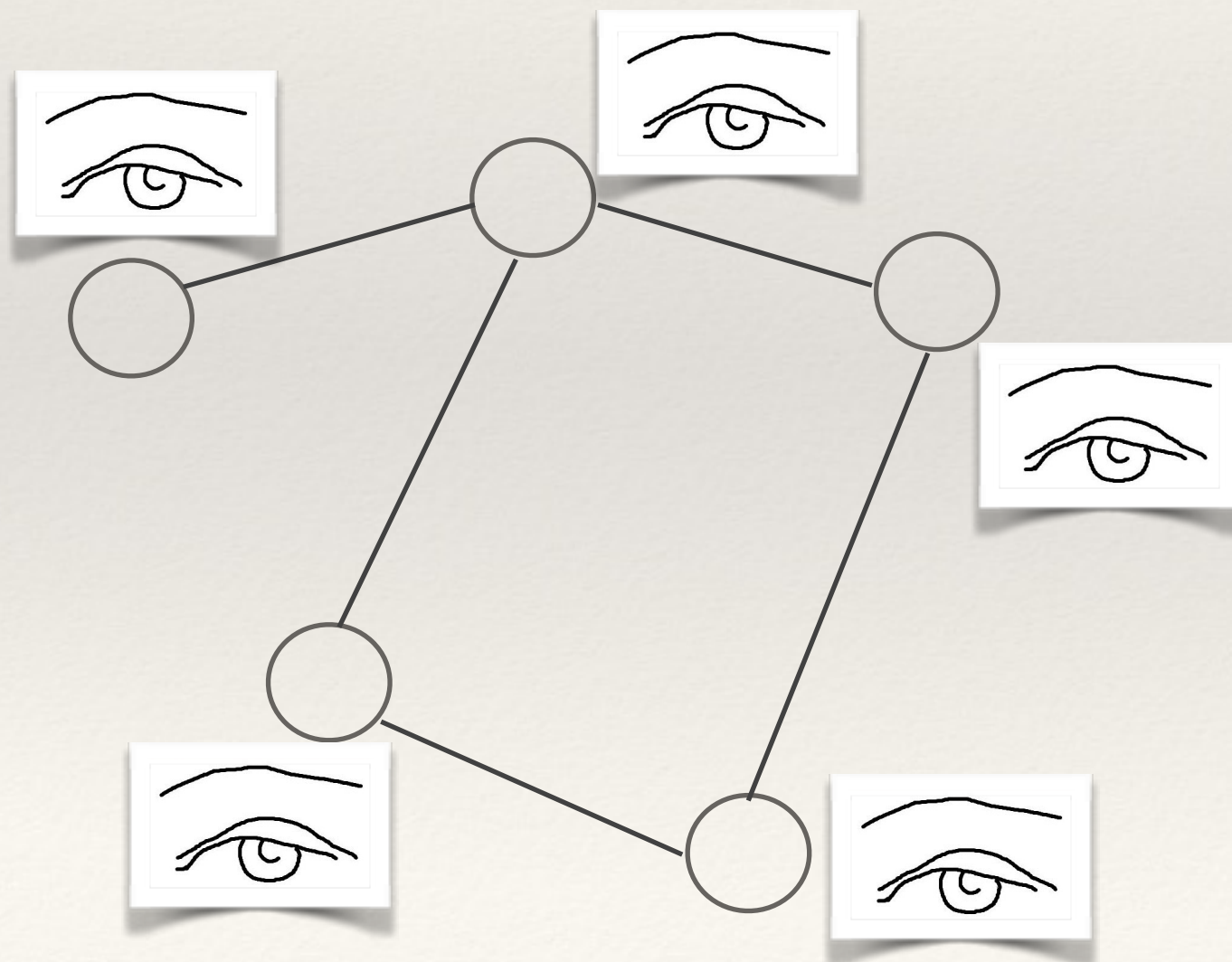
Zielonka???



# Zielonka automata

[Zielonka 1989]

monitor = finite-state automaton



synchronization:

shared actions +

exchange of information

---

# Example

---

compare-and-swap    **CAS** (T,x,old,new)

T is a thread, x a shared variable

if the value of x is old, then replace it by new;

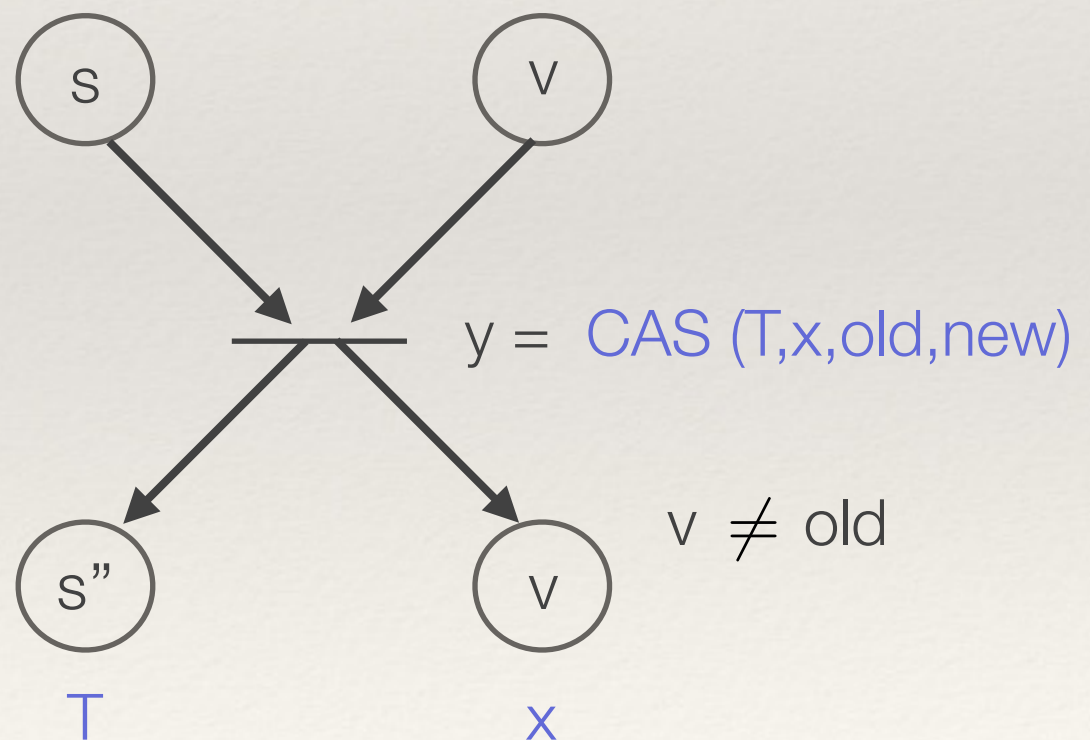
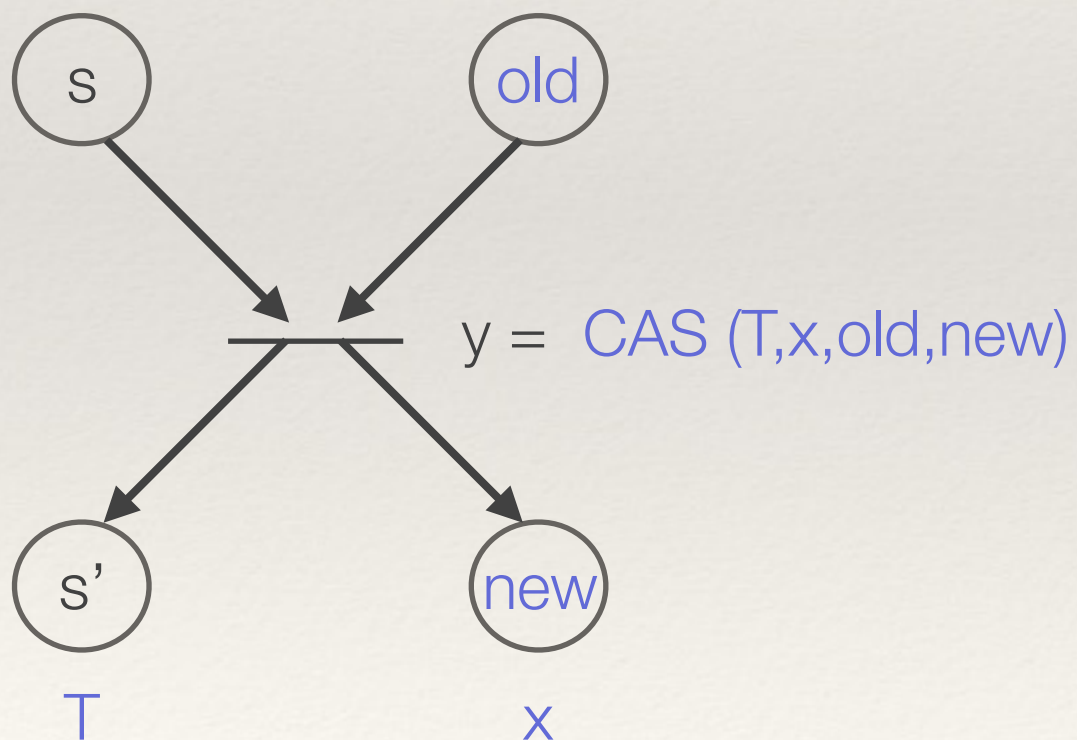
otherwise do nothing

returns 1 if the value was replaced, 0 otherwise

# Example

compare-and-swap **CAS** (T,x,old,new)

if the value of **x** is **old**, then replace it by **new**;  
otherwise do nothing



---

# Zielonka automaton

---

- ❖ fixed set of processes  $\mathcal{P}$
- ❖ one finite-state automaton per process
- ❖ each shared action  $a$  synchronizes a fixed set of processes:

$$\text{dom}(a) \subseteq \mathcal{P}$$

Upon executing  $a$ , processes in  $\text{dom}(a)$  exchange information about their states.

---

# Zielonka's theorem

---

Construction of deterministic Zielonka automaton for every regular **trace language**.

[Zielonka, 1989]

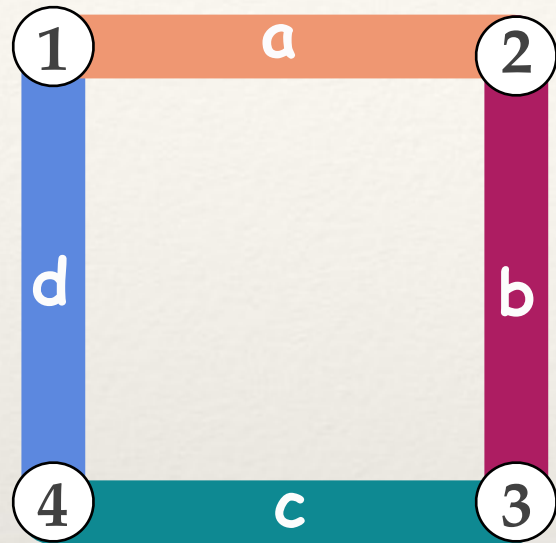
Crux: finite gossiping

Complexity: from several exponentials down to

From a DFA of size **s**, constructs equivalent Zielonka automaton on **p** processes with  $4^{p^4} \cdot s^{p^2}$  states.

[Genest-Gimbert-M.-Walukiewicz, 2010]

# Zielonka construction



$$\text{dom}(a) = \{1, 2\}$$

$$\text{dom}(b) = \{2, 3\}$$

$$\text{dom}(c) = \{3, 4\}$$

$$\text{dom}(d) = \{4, 1\}$$

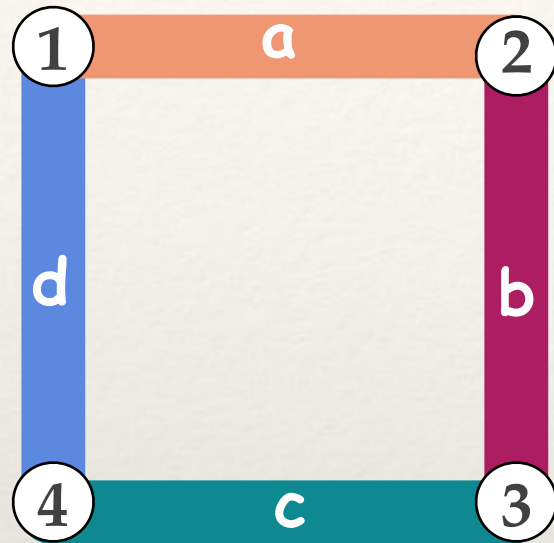
$$[(a + c)(b + d)]^*$$



not allowed



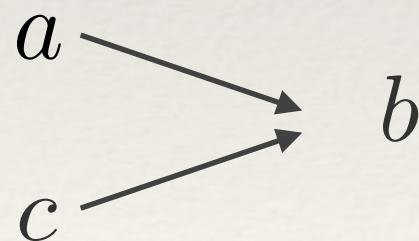
# Zielonka construction



$$[(a + c)(b + d)]^*$$

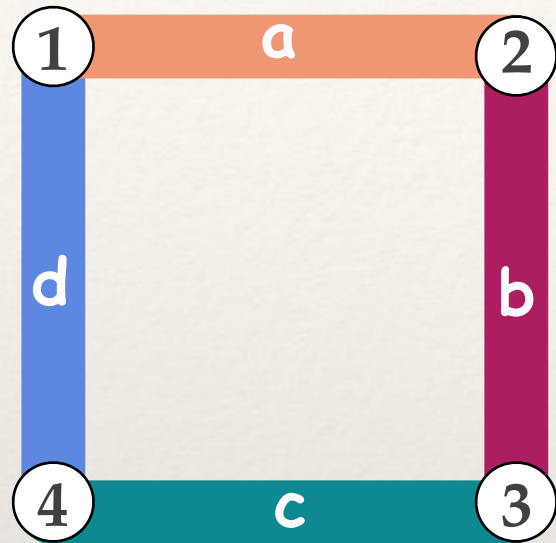
What should each process remember?

Each process remembers its last action: not sufficient



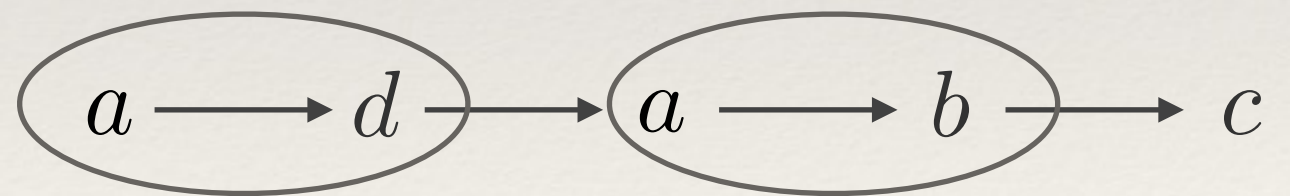
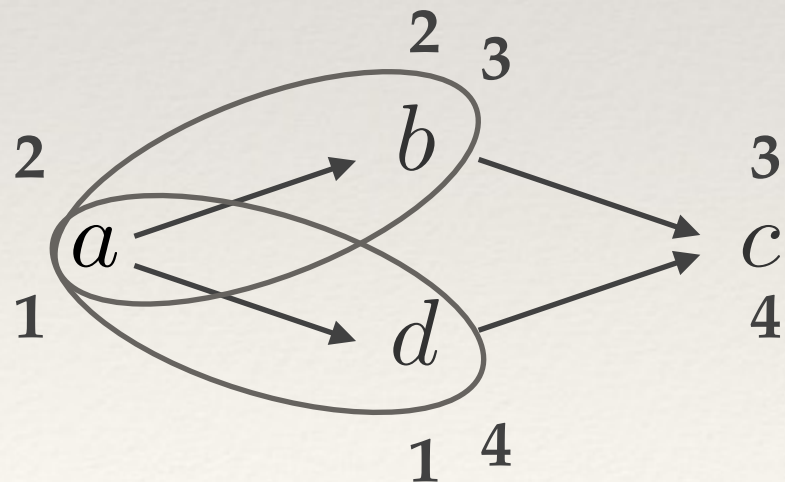
process 2:  $b$  (after  $a$ )  
process 3:  $b$  (after  $c$ )

# Zielonka construction



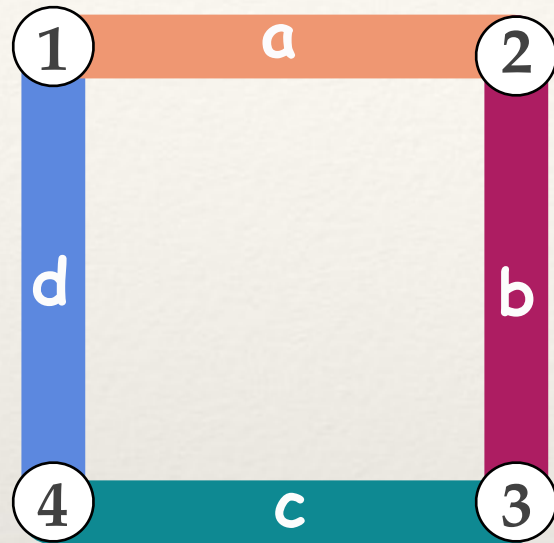
$$[(a + c)(b + d)]^*$$

Each process remembers its last action **and** the last action of its synchronization partner.



Not sufficient.

# Gossip



$$[(a + c)(b + d)]^*$$

Solution here: each process keeps the order of the last occurrences of all symbols.

... as complicated as ...

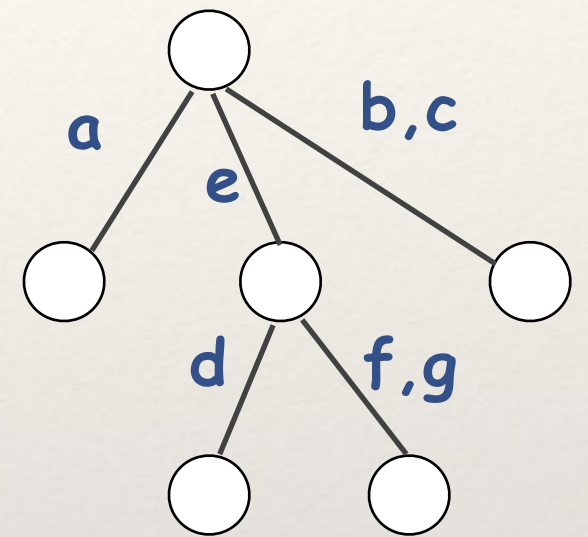
General solution: each process keeps latest information about other processes (gossip).

Gossip = kind of vector clock algorithm, but finite.

# Zielonka going practical

Construction of deterministic Zielonka automata for regular **trace languages**: **quadratic-time** when the communication between processes is **acyclic**.

[Krishna-M., 2013]

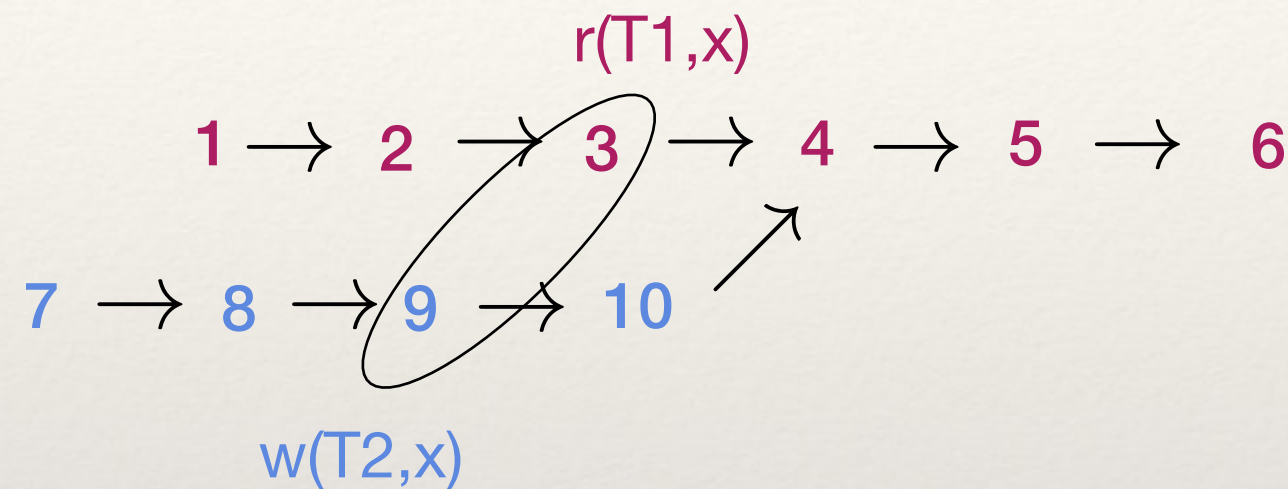


Is quadratic-time good enough?

Not if we start with very large DFA.

# Zielonka going practical

Example: **races**



Apply Zielonka to properties stated by **patterns**.

**Pattern** =

DAG with vertices corresponding to monitored actions

# Zielonka going practical

Processes: thread1, thread2, lock

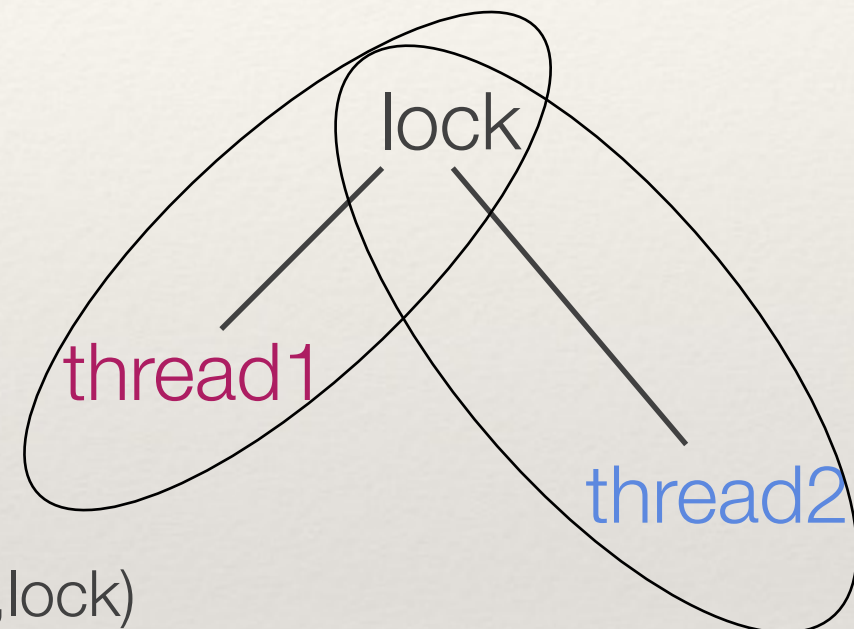
```
type list {int data; list *next}  
list *head
```

## Thread 1

```
1: t1 = new(list);  
2: t1.data = 42;  
3: t1.next = head;  
4: acq(lock)  
5: head = t1  
6: rel(lock)
```

## Thread 2

```
7: t2 = head;  
8: acq(lock)  
9: head = head.next  
10: rel(lock)
```



acq(thread1,lock)

rel(thread1,lock)

acq(thread2,lock)

rel(thread2,lock)

Efficient **race monitoring** if communication is acyclic.

---

# Monitoring: summary

---

- ❖ Zielonka's construction: general-purpose solution for **distributed runtime monitoring with finite memory**.
- ❖ The general construction requires polynomial memory on each process.
- ❖ Lightweight construction for acyclic architectures.
- ❖ Efficiency depends on what we start with. (Boolean combinations of) patterns are better than DFA.
- ❖ Zielonka's construction: also used for other kinds of synchronization, e.g. messages.

# Outline

---

- ❖ Motivating examples
- ❖ Mazurkiewicz traces
- ❖ Distributed monitoring
- ❖ Distributed control

Pnueli-Rosner

Ramadge-Wonham

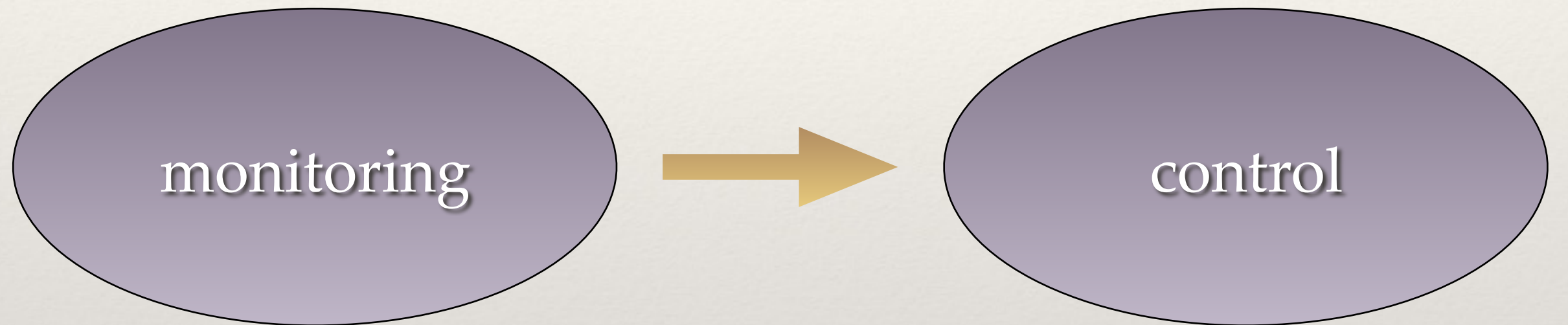
- ❖ Conclusion



---

# Error recovery: control

---



error detection

restrict program execution  
prevent error propagation

...

# Control: basics

Church (1957)

Given: specification  $S \subseteq \{0, 1\}^\omega \times \{0, 1\}^\omega$   
relating inputs/outputs

Compute  $\mathbf{C}$  that satisfies  $S$

for all  $w \in \{0, 1\}^\omega$  :  $(w, C(w)) \in S$



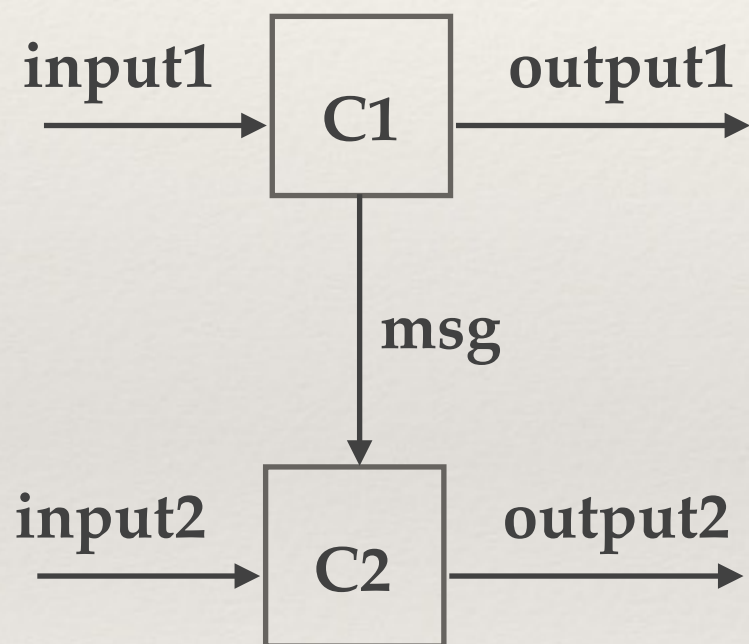
$\mathbf{C}$ : device reacting continuously

function  $C : \{0, 1\}^* \rightarrow \{0, 1\}$

[Rabin, 1972] If  $S$  is omega-regular the existence of a controller can be decided. If “yes”, then there exists a finite-state controller  $\mathbf{C}$ .

# Distributed control

[Pnueli-Rosner, 1990] Distributed reactive systems are hard to synthesize.



synchronous behavior

|                |   |   |   |   |
|----------------|---|---|---|---|
| <b>input1</b>  | 0 | 0 | 1 | 1 |
| <b>msg</b>     |   | 0 | 0 | 1 |
| <b>input2</b>  | 1 | 0 | 0 | 0 |
| <b>output1</b> |   | 1 | 1 | 0 |
| <b>output2</b> |   | 1 | 1 | 0 |

Given an architecture and an omega-regular specification  $S$ , construct controllers  $C1, C2, \dots$  such that all controlled behaviors belong to  $S$ .

---

# Pnueli-Rosner

---

Distributed synthesis is in general undecidable. It is decidable iff the architecture is a pipeline (non-elementary complexity).

[Pnueli-Rosner, 1990]

Undecidability comes from partial information:

[Peterson-Reif, 1979] Multi-person alternation

Basic problem: Specification may talk about inputs that are not seen by some process.

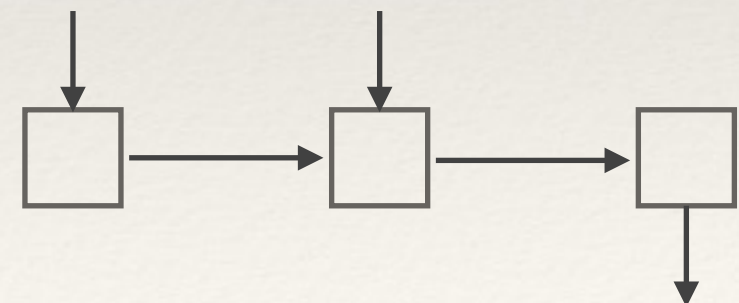
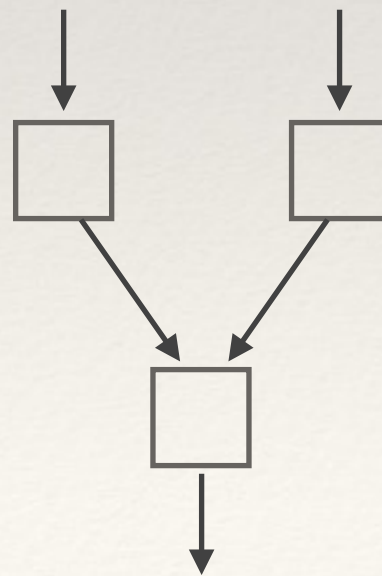
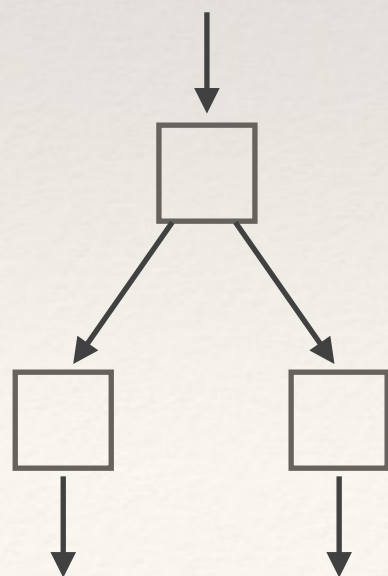
# Pnueli-Rosner

Undecidability: a problem with specifications?

**Local** specifications: conjunction of requirements on each process.

For local specifications, the only decidable architecture is basically the pipeline.

[Madhusudan-Thiagarajan, 2001]



undecidable

---

# Pnueli-Rosner : summary

---

- ❖ Simple extension of the Church setting
- ❖ Very few cases are decidable
- ❖ Even local specifications do not help
- ❖ Unsolved problem: define specifications that are **compatible** with the architecture
- ❖ Open: decidable architectures when controllers can add information to messages

[Kupferman-Vardi, 2001] Synthesizing distributed systems

[Finkbeiner-Schewe, 2005] Uniform distributed synthesis

[Gastin-Sznajder, 2013] External specifications

# Outline

---

- ❖ Motivating examples
- ❖ Mazurkiewicz traces
- ❖ Distributed monitoring
- ❖ Distributed control

Pnueli-Rosner

Ramadge-Wonham

- ❖ Conclusion



---

# Distributed control: a different approach

---

Approach based on

- ❖ Zielonka automata
- ❖ Ramadge-Wonham control setting

[Ramadge-Wonham, 1989] The control of discrete-event systems

- ❖ Given: Plant (automaton) **A** with controllable (system) actions and uncontrollable (environment) actions, and specification **S**.
- ❖ Compute controller **C** such that **A** x **C** satisfies **S**.  
**C** must allow all uncontrollable actions.

---

# Zielonka automata

---

- ❖ fixed set of processes  $\mathcal{P}$
- ❖ one finite-state automaton per process
- ❖ each shared action  $a$  is located on a fixed set of processes

$$\text{dom}(a) \subseteq \mathcal{P}$$

Upon executing  $a$ , processes in  $\text{dom}(a)$  exchange information about their states.

---

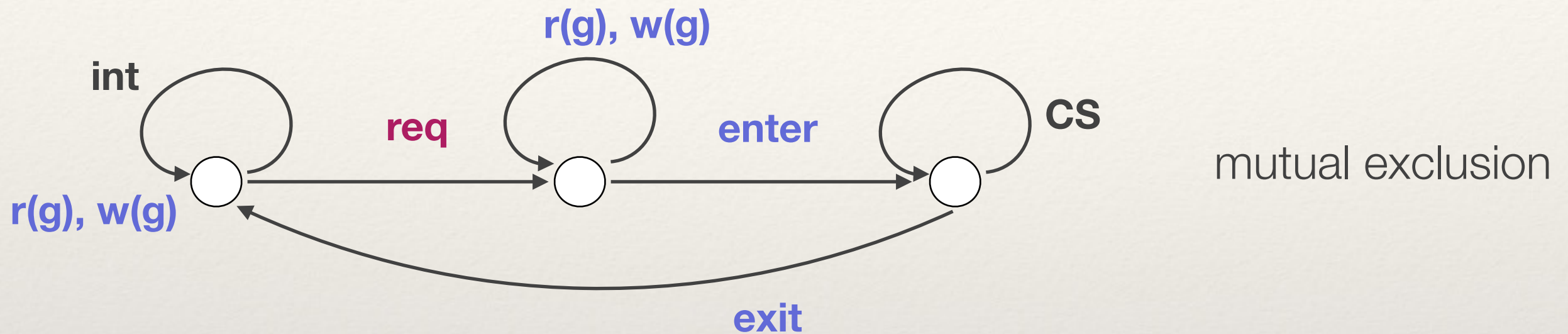
# Distributed control

---

- ❖ Given: Zielonka automaton **A** with **controllable** (system) actions and **uncontrollable** (environment) actions, and specification **S**.
  - ❖ Compute another Zielonka automaton (controller) **C** such that **A** x **C** satisfies **S**.
- C** must **allow all uncontrollable** actions.

**Controllers are local and exchange information in order to satisfy S.**

# Distributed control and synthesis



requests **req**: uncontrollable actions

mutual exclusion algorithm: distributed controller for  $n+1$  processes

$n$  processes + 1 process for the shared variable

---

# Control & Zielonka automata

---

## Setting:

- ❖ A **controller** for each process.
- ❖ Controller of process  $p$  can disallow some of  $p$ 's **controllable** actions.
- ❖ Control decisions for  $p$  depend on information in the causal past of  $p$ , i.e., including communication with other controllers.

**Decidability status is open.** No hidden information.

---

# Control & Zielonka automata

---

## Some partial decidability results:

[Madhusudan-Thiagarajan-Yang, 2005] Decidability for **restricted** Zielonka automata: every process misses only **bounded knowledge**. MSO specifications.

[Gastin-Lerman-Zeitoun, 2004] Decidability for restricted automata: **series-parallel** systems. Reachability specifications.

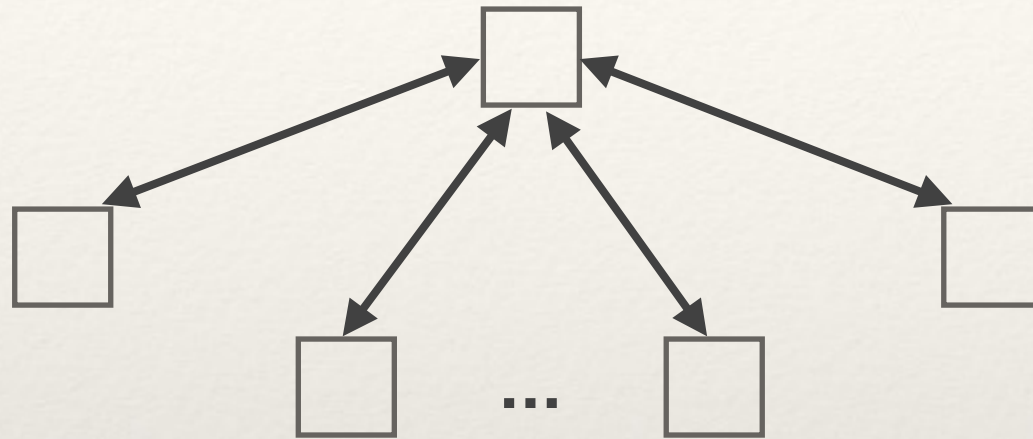
[Genest-Gimbert-M-Walukiewicz, 2013] Decidability for **acyclic process communication**. Local reachability (blocking). Complexity is Tower(2,n)-complete.

[M-Walukiewicz, 2014] Decidability for **acyclic** process communication. Local **parity specifications**. Complexity is Tower(2,n)-complete.

---

# Control & Zielonka automata

---



Control is decidable (EXPTIME-complete).

This architecture is undecidable in the Pnueli-Rosner setting.

---

# Control & Zielonka automata

---

Why is control for Zielonka automata still open?

- ❖ Control for Zielonka automata reduces to satisfiability of monadic second-order (MSO) formula over the **event structure** of the automaton.
- ❖ These event structures can be rather complicated (grids), so MSO satisfiability is undecidable in general.

---

# Control & Zielonka automata

---



words, trees...

...traces, event structures



---

# Control & Zielonka automata: summary

---

- ❖ Simple extension of the Ramadge-Wonham control setting
- ❖ More cases are decidable: acyclic communication, local parity specifications
- ❖ Open: cyclic architectures
- ❖ Unsolved: understanding event structures of Zielonka automata

---

# Conclusion

---

Error recovery for concurrent programs  
requires **distributed** monitoring and control

- ❖ **Mazurkiewicz traces**: automata-theoretic reasoning about concurrent programs is in reach.
- ❖ Distributed **monitoring**: synthesis of monitors through Zielonka construction.
- ❖ Distributed **control**: synthesis of controllers that can alter behavior.

---

# Outlook

---

- ❖ Synthesis of distributed monitors using Lamport's vector clocks?
- ❖ Synthesis of distributed monitors if the set of (active) processes in the system is unknown?
- ❖ Our monitor/synthesis algorithm is conservative (no additional synchronizations). If we allow additional synchronizations, how should they be quantified?

Thank you!