

# Partial-Observation Stochastic Games: How to Win when Belief Fails

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GT Jeux  
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# Outline

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- Game model: example
- Challenges & Results: examples
- Solution insights: examples

# Examples

- Poker
  - partial-observation
  - stochastic



# Examples

- Poker
  - partial-observation
  - stochastic



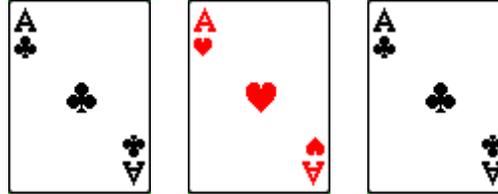
- Bonneteau



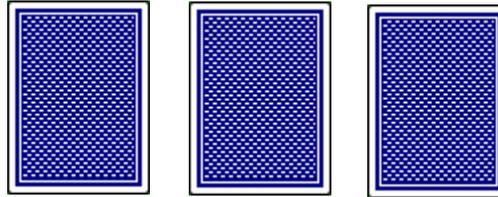
# Bonneteau

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2 black card, 1 red card



Initially, all are face down



Goal: find the red card

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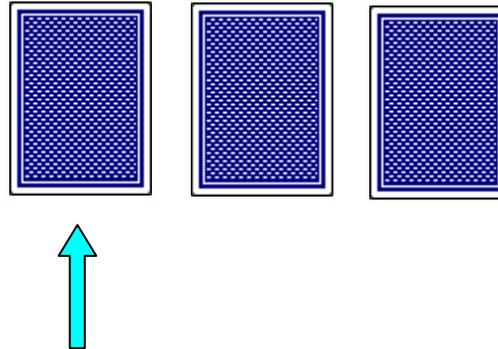
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1. Player 1 points a card
2. Player 2 flips one remaining black card
3. Player 1 may change his mind, wins if pointed card is red

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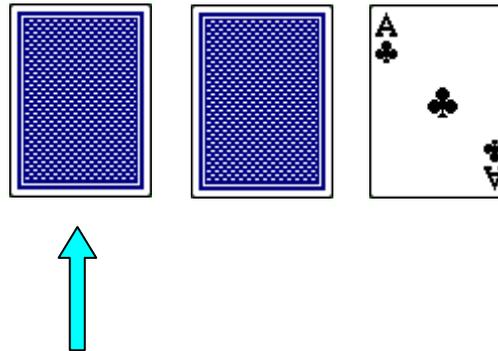
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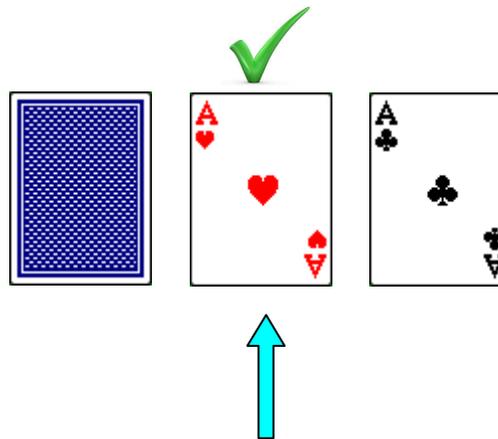
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# Bonneteau: Game Model

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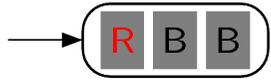
→ R B B

→ B R B

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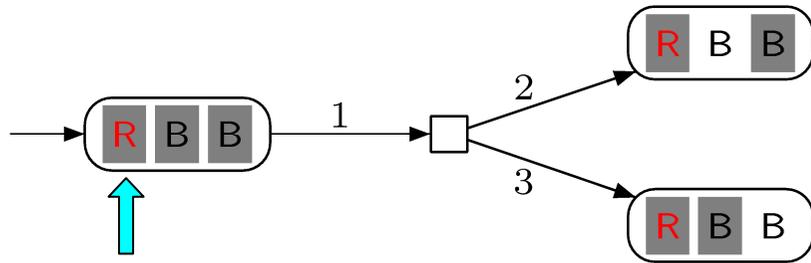
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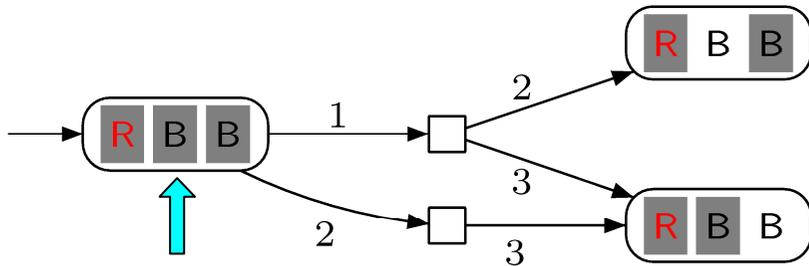
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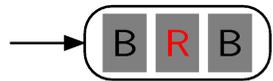
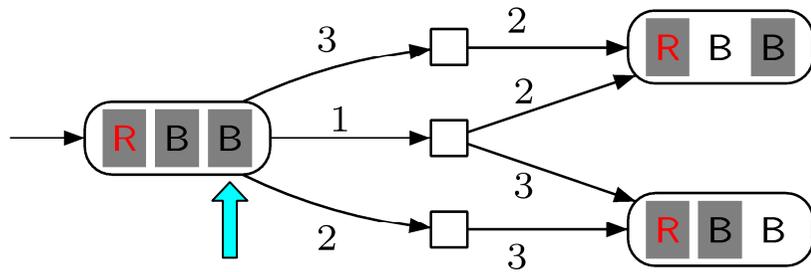
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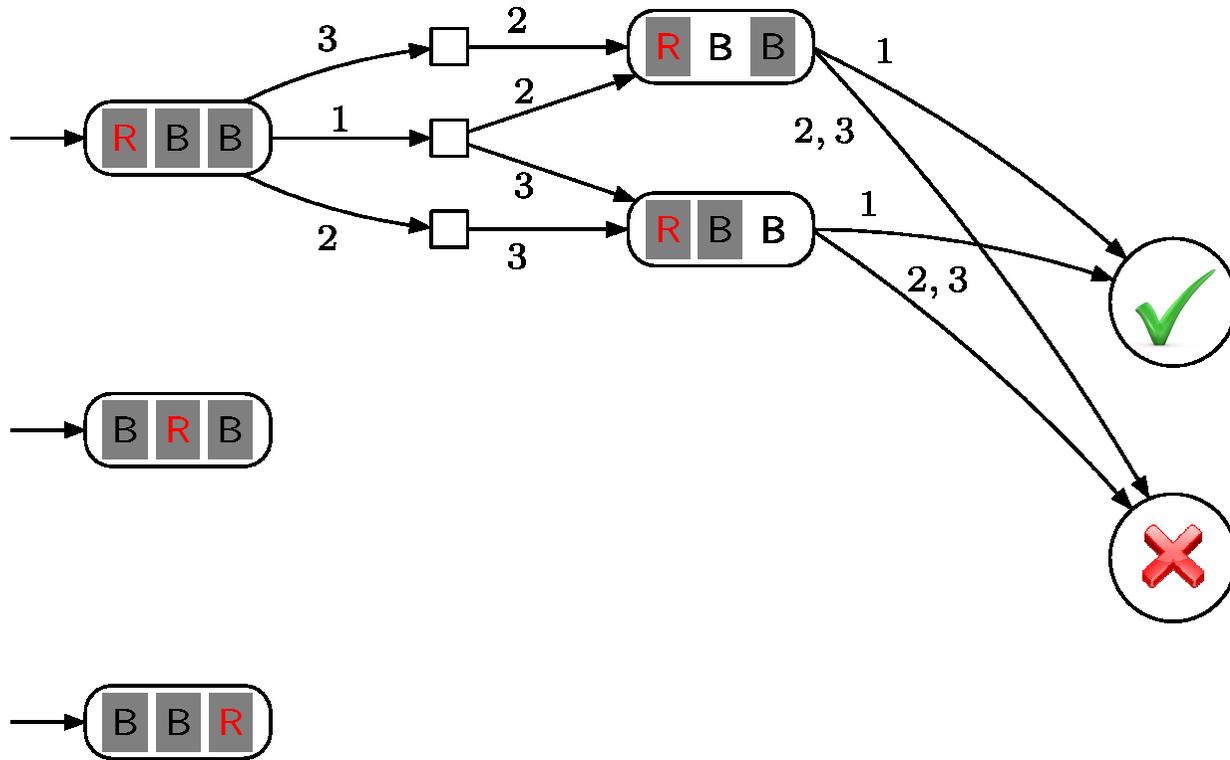


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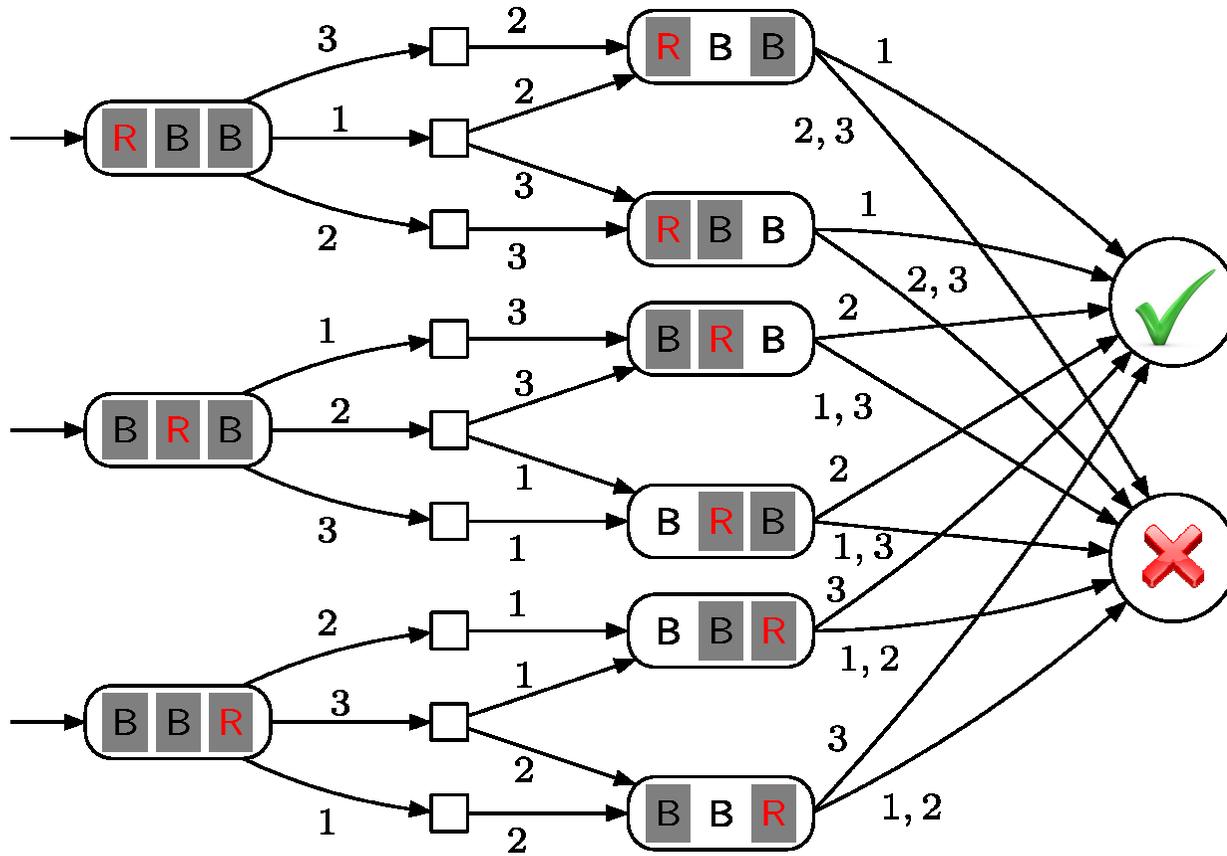
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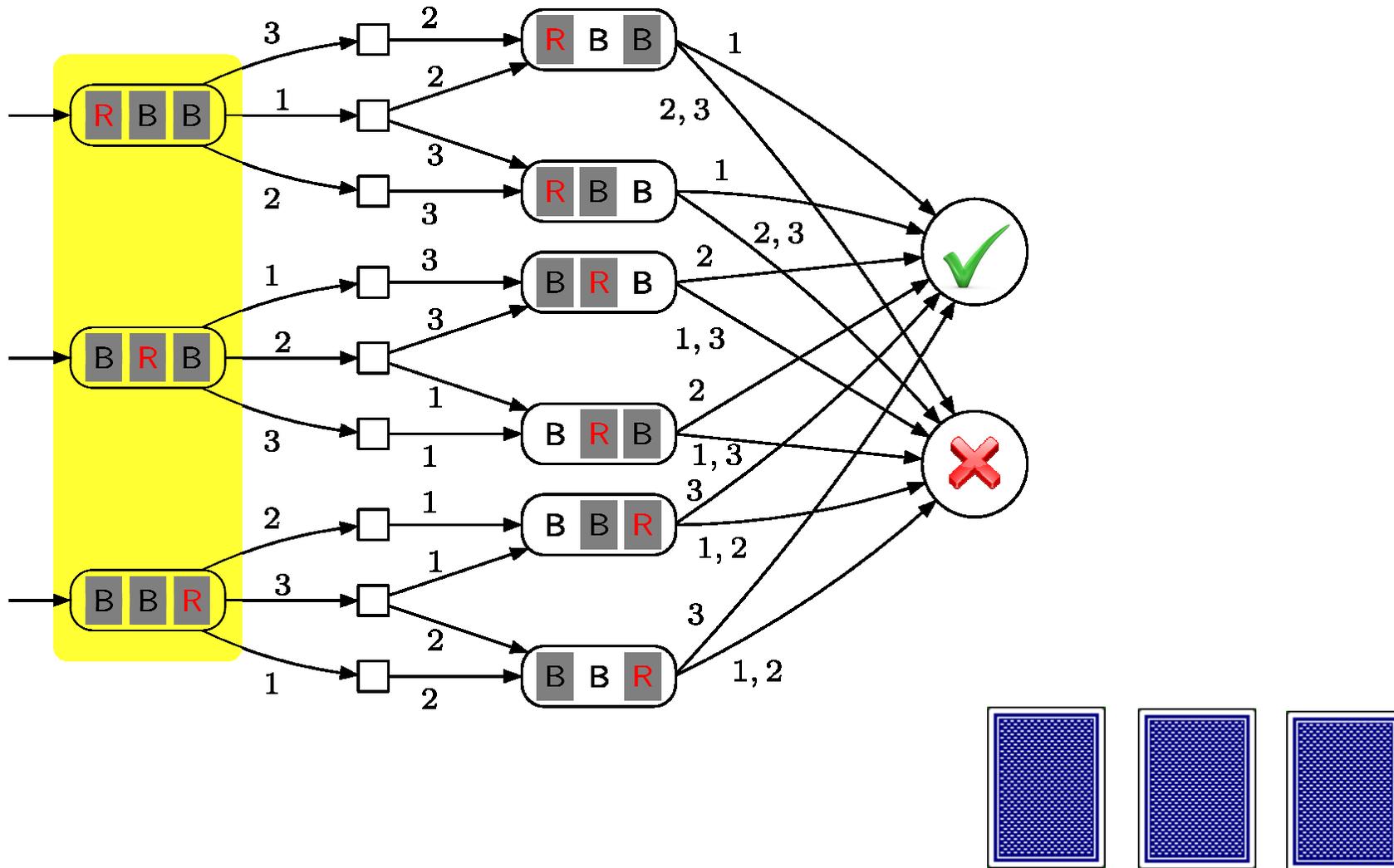
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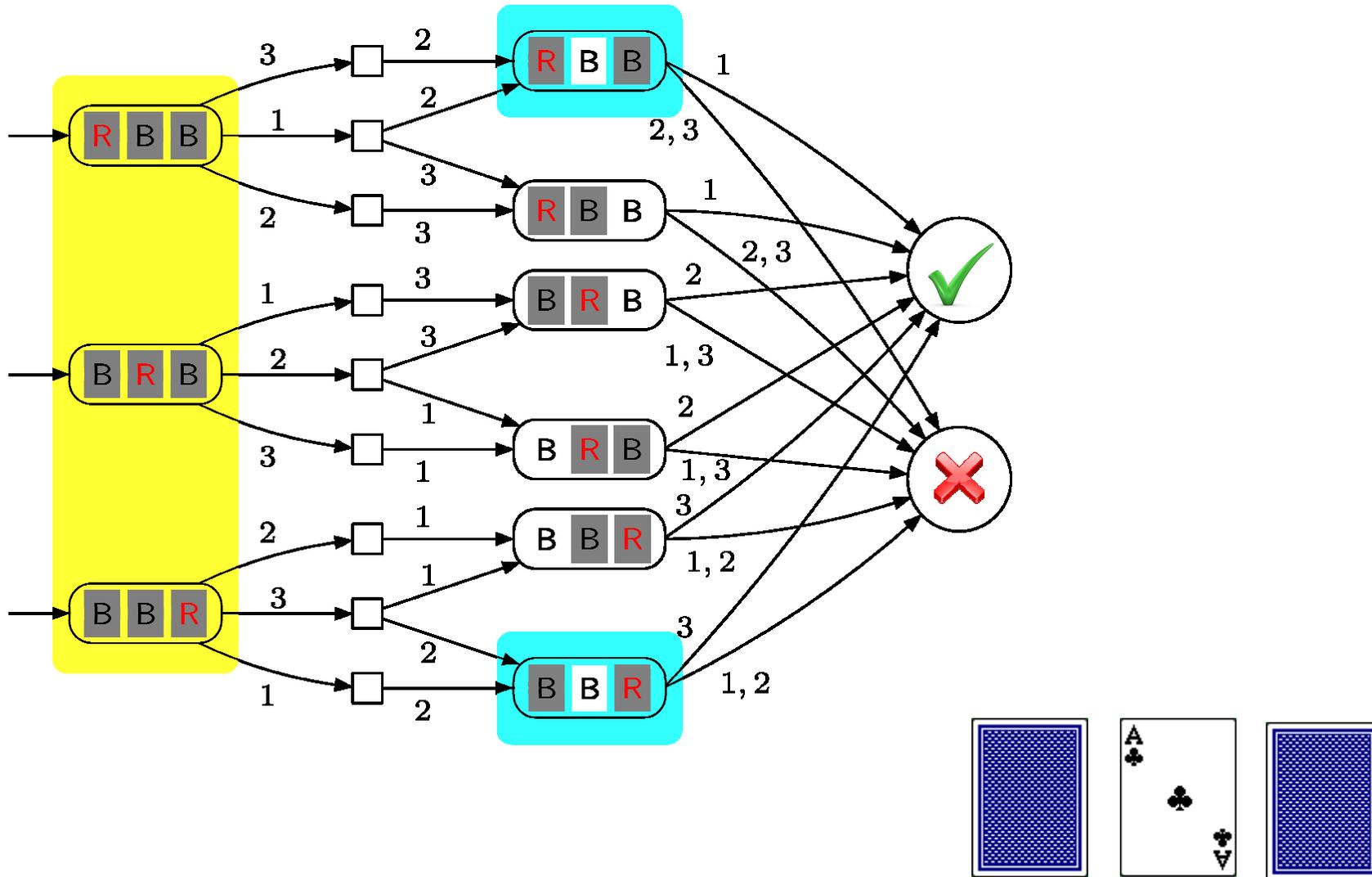
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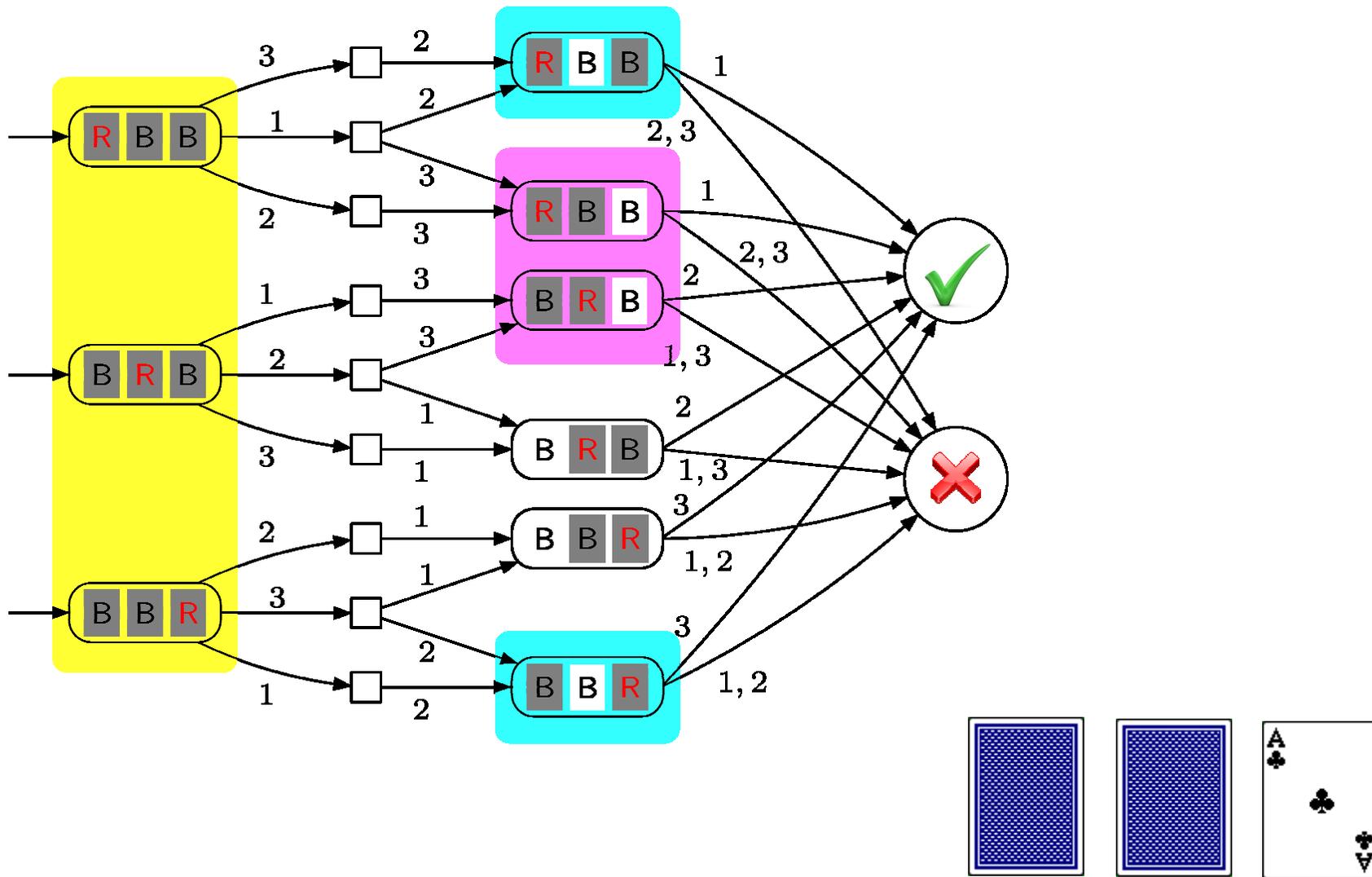
# Observations (for player 1)



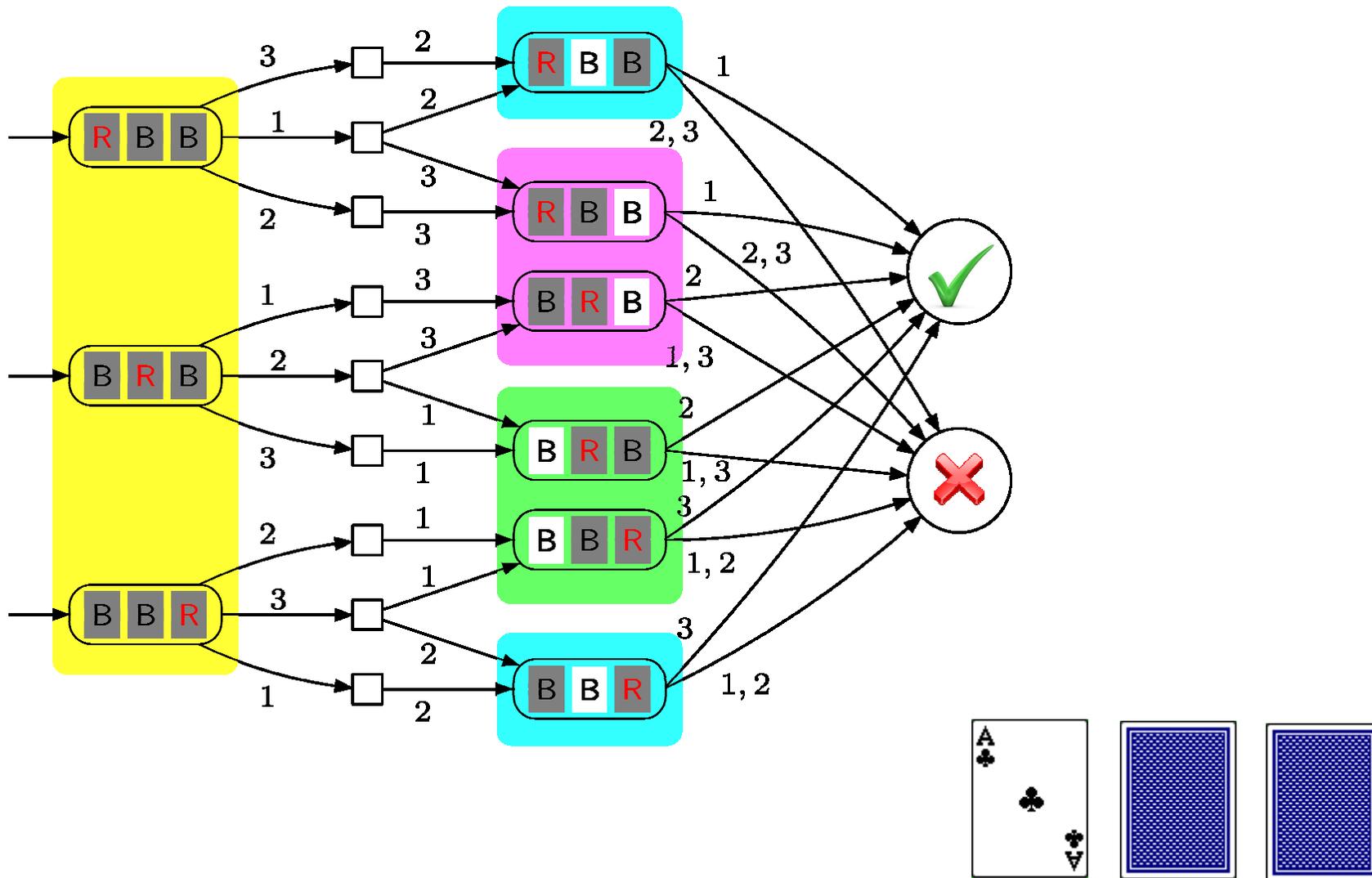
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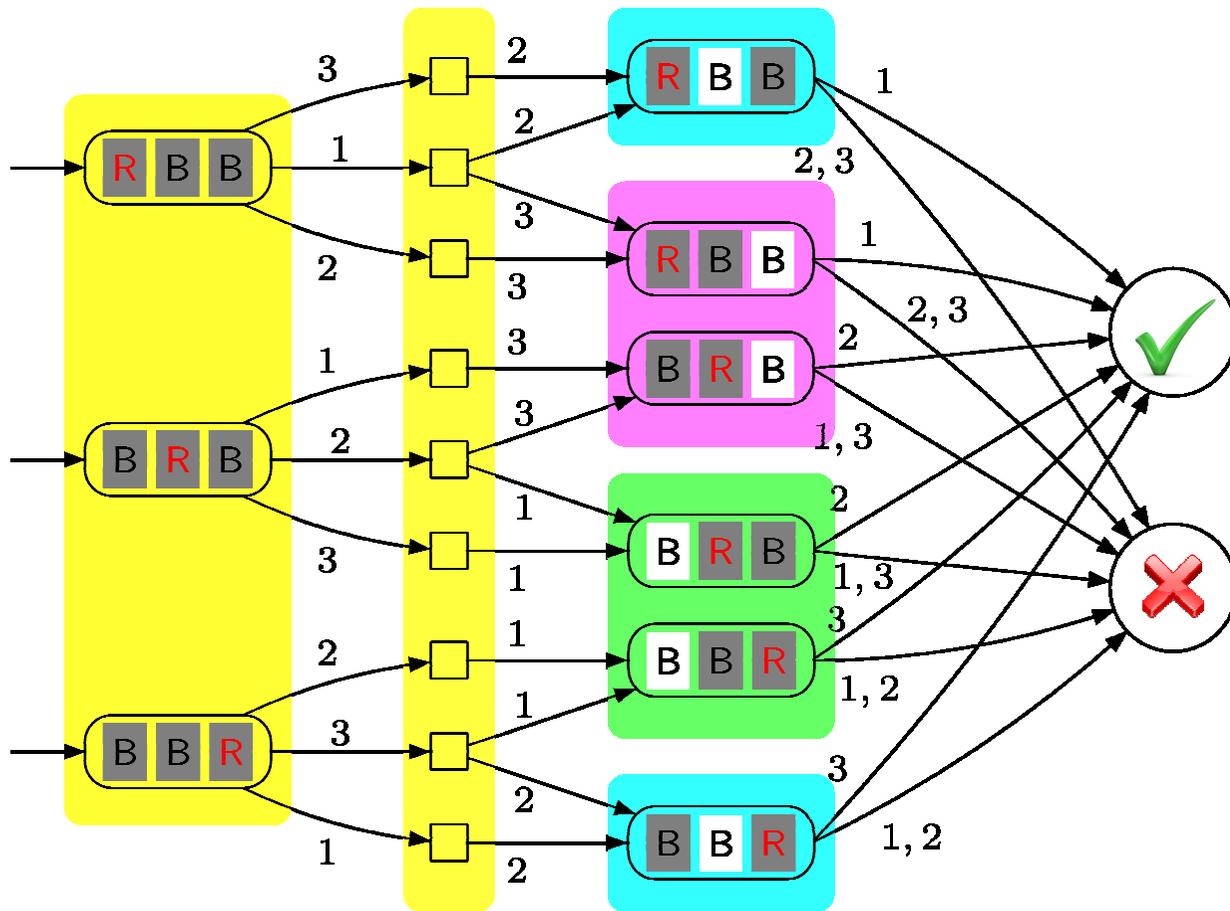
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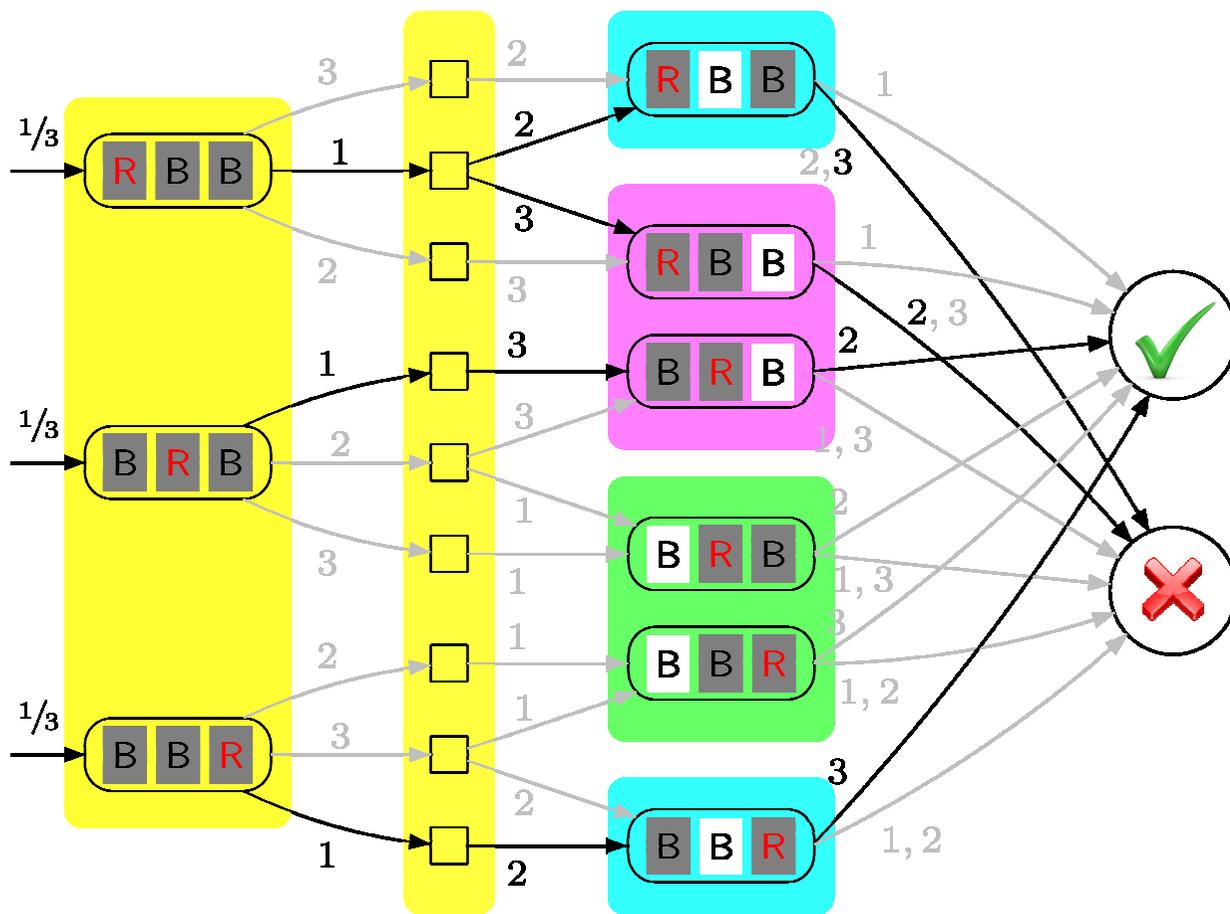
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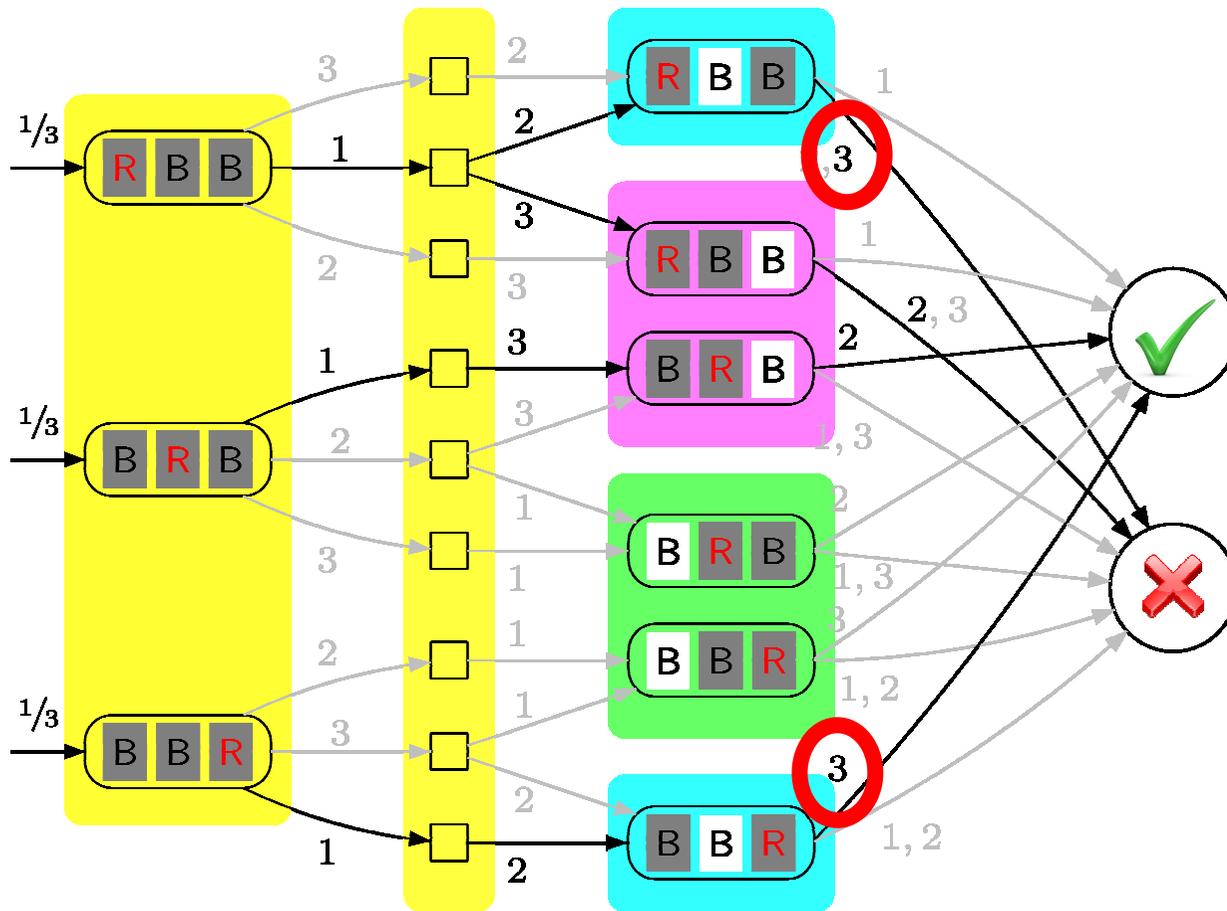


# Observation-based strategy



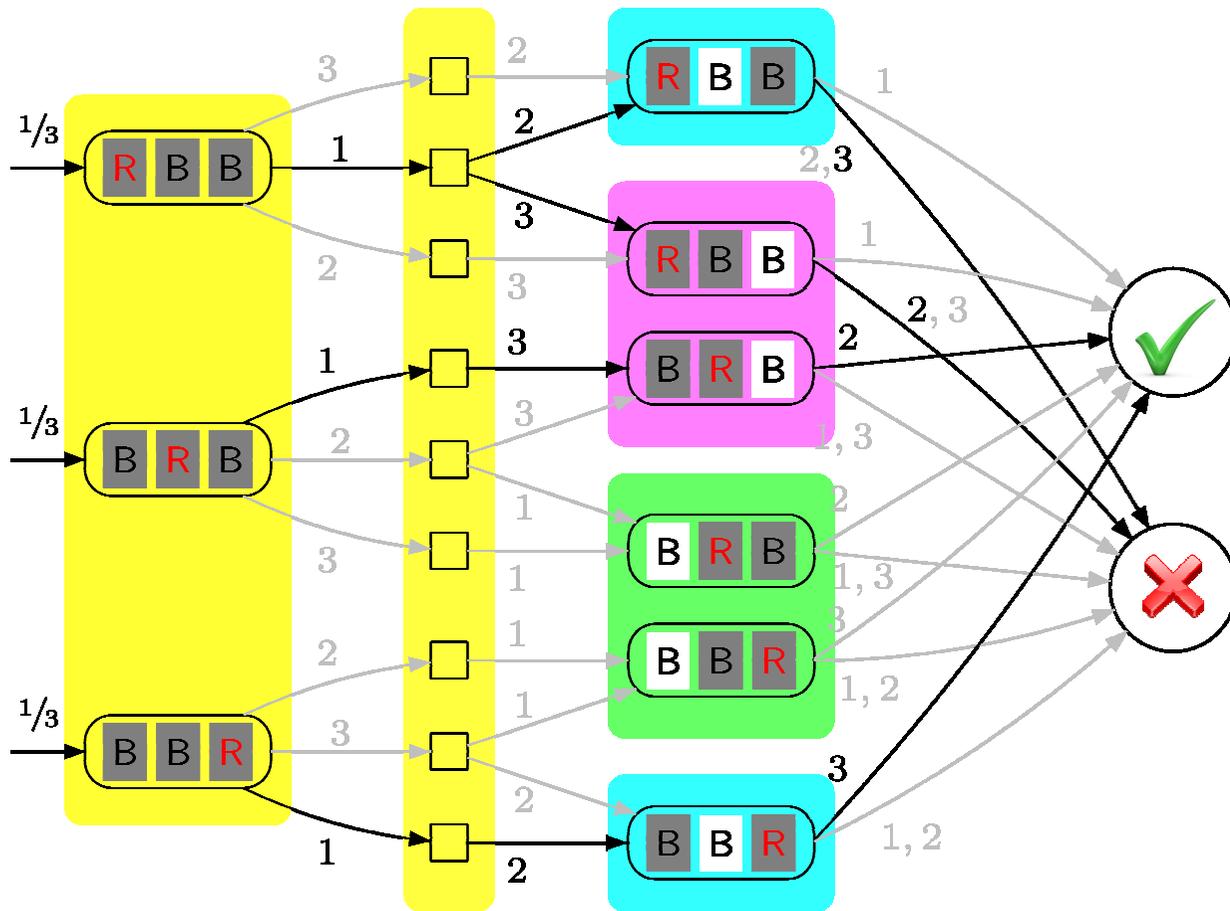
This strategy is **observation-based**,  
 e.g. after , ,  it plays 3

# Observation-based strategy



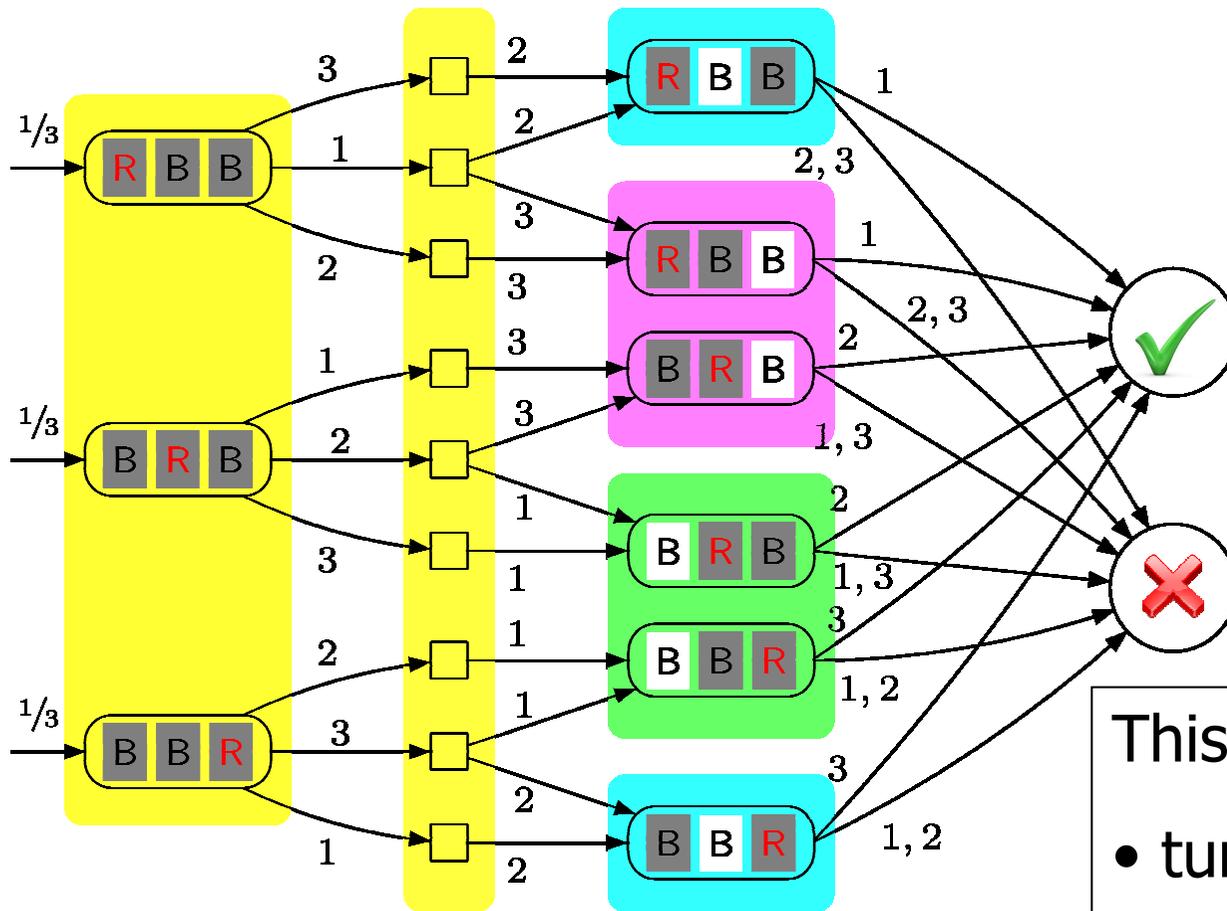
This strategy is **observation-based**,  
 e.g. after  ,  ,   it plays 3

# Optimal ?



This strategy is winning with probability  $2/3$

# Example



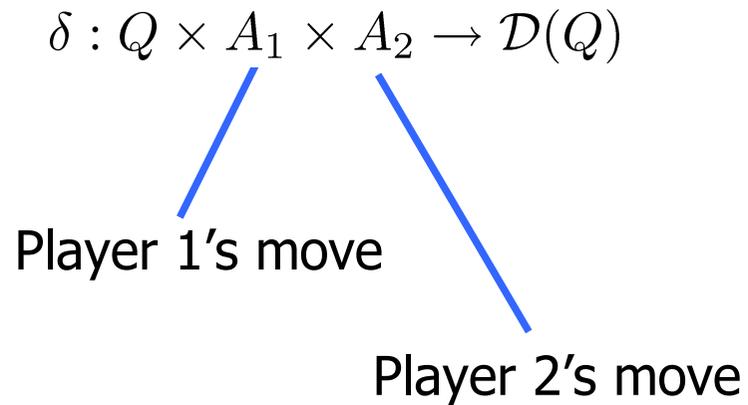
This game is:

- turn-based
- (almost) non-stochastic
- player 2 has perfect observation

# Interaction

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General case: concurrent & stochastic

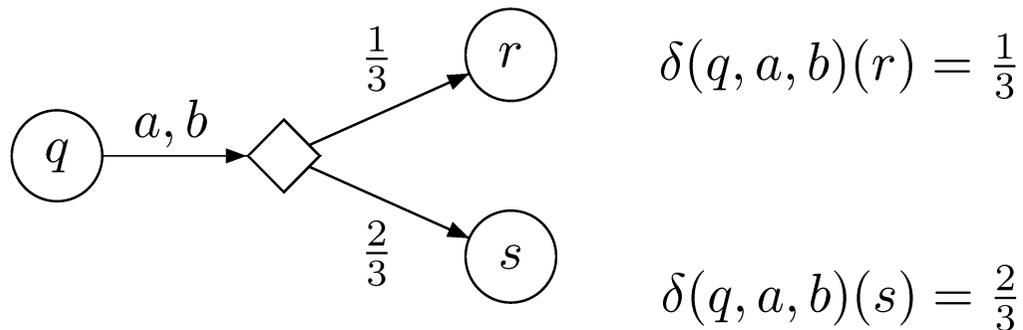
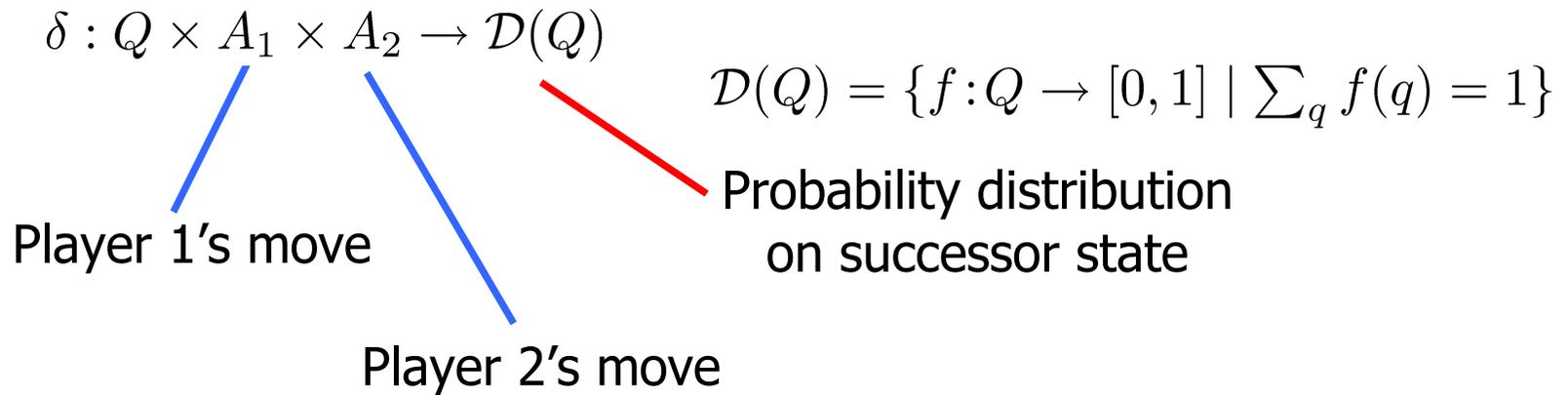


Players choose their moves simultaneously and independently

# Interaction

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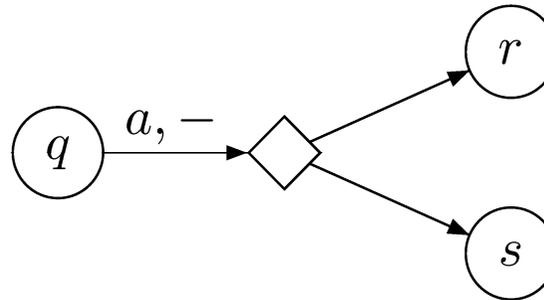


# Interaction

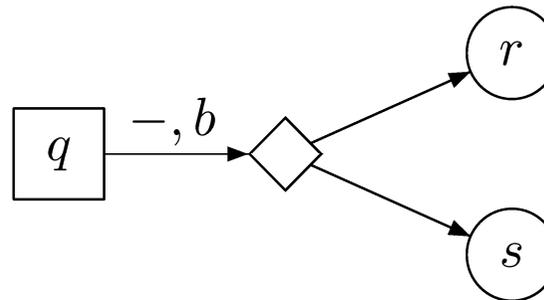
Special cases:

Turn-based games

• player-1 state



• player-2 state



Note:



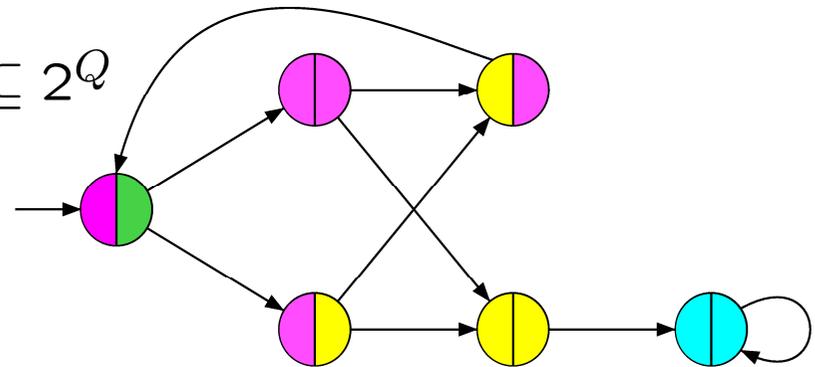
# Partial-observation

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Observations: partitions induced by coloring

General case: **2-sided** partial observation

Two partitions  $Obs_1 \subseteq 2^Q$  and  $Obs_2 \subseteq 2^Q$

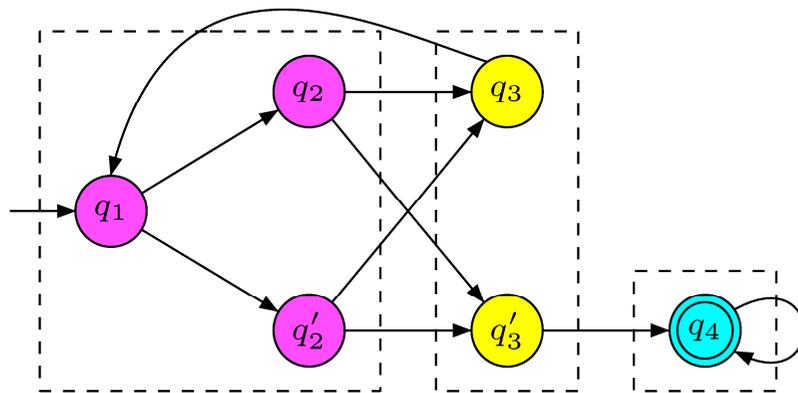
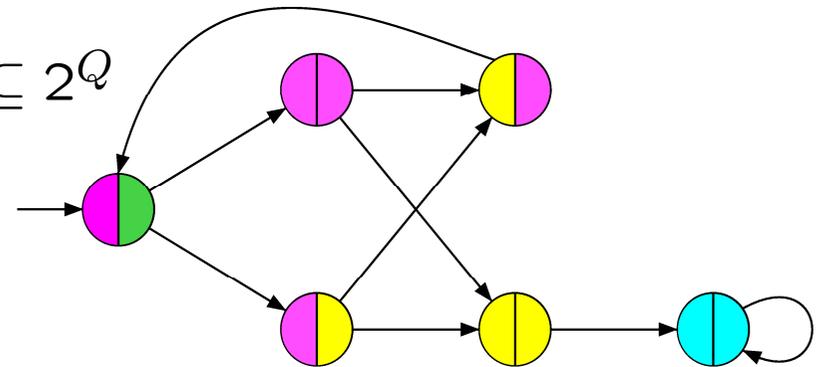


# Partial-observation

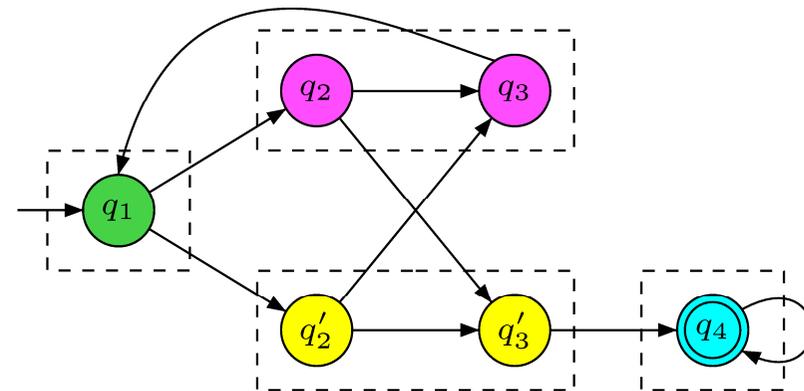
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General case: **2-sided** partial observation

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Player 1's view



Player 2's view

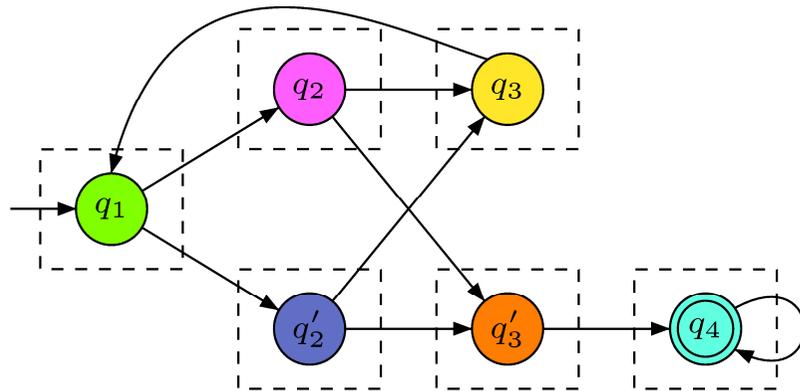
# Partial-observation

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Observations: partitions induced by coloring

Special case: **1-sided** partial observation

$$\text{Obs}_1 = \{\{q\} \mid q \in Q\} \quad \text{or} \quad \text{Obs}_2 = \{\{q\} \mid q \in Q\}$$



View of **perfect-observation** player

# Strategies & objective

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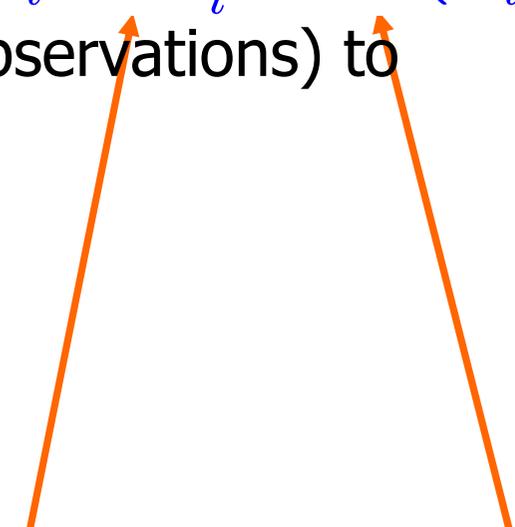
A strategy for Player  $i$  is a function  $\sigma_i : \text{Obs}_i^+ \rightarrow \mathcal{D}(A_i)$  that maps histories (sequences of observations) to probability distribution over actions.

# Strategies & objective

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History-depedent      randomized



# Strategies & objective

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A strategy for Player  $i$  is a function  $\sigma_i : \text{Obs}_i^+ \rightarrow \mathcal{D}(A_i)$  that maps histories (sequences of observations) to probability distribution over actions.

Reachability objective:  $\mathcal{T} \subseteq Q$

Winning probability of  $\sigma_1$ :  $\inf_{\sigma_2} Pr_{q_0}^{\sigma_1, \sigma_2} (\exists i \geq 0 : q_i \in \mathcal{T})$

# Qualitative analysis

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The following problem is undecidable:  
(already for probabilistic automata [Paz71])

Decide if there exists a strategy for player 1 that is winning with probability at least  $\frac{1}{2}$ .

# Qualitative analysis

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Decide if there exists a strategy for player 1 that is winning with probability at least  $\frac{1}{2}$ .

Qualitative analysis:

- **Almost-sure**: ... winning with probability 1
- **Positive**: ... winning with probability  $> 0$

$$\exists \sigma_1 \cdot \forall \sigma_2 : Pr_{q_0}^{\sigma_1, \sigma_2} (\exists i \geq 0 : q_i \in \mathcal{T}) \begin{cases} = 1 \\ > 0 \end{cases}$$

# Applications in verification

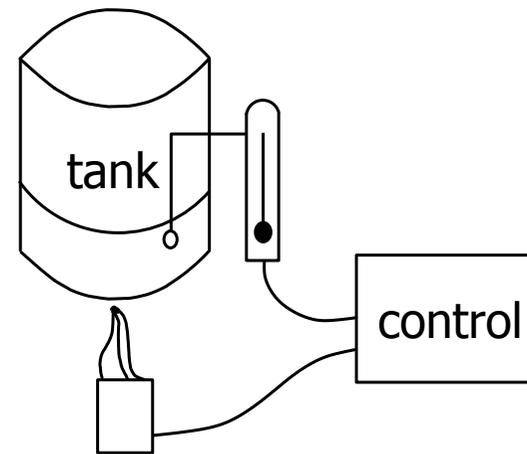
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- Control with inaccurate digital sensors
- multi-process control with private variables
- multi-agent protocols
- planning with uncertainty/unknown

```
void main () {
  int got_lock = 0;
  do {
1:   if (*) {
2:     lock ();
3:     got_lock++;
   }
4:   if (got_lock != 0) {
5:     unlock ();
   }
6:   got_lock--;
  } while (*);
}
```

```
void lock () {
  assert(L == 0);
  L = 1;
}
```

```
void unlock () {
  assert(L == 1);
  L = 0;
}
```



# Outline

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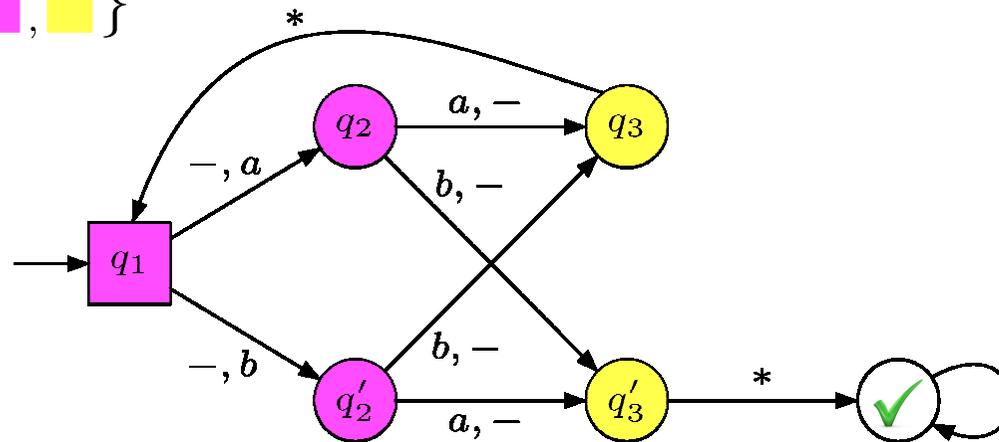
- Game Model: example
- Challenges & Results: examples
- Solution insights: examples

# Randomization is necessary

Player 1 partial, player 2 perfect

$\text{Obs}_1 = \{ \text{pink}, \text{yellow} \}$

$$\sigma_i : \text{Obs}_i^+ \rightarrow \mathcal{D}(A_i)$$

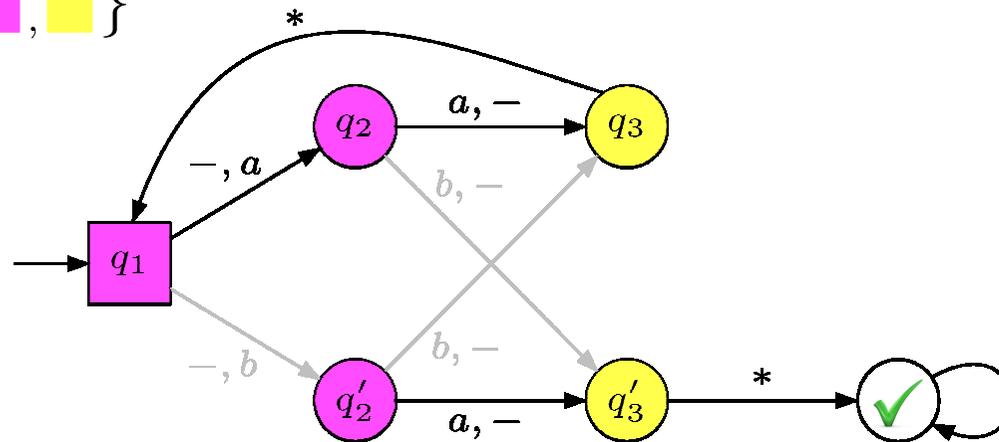


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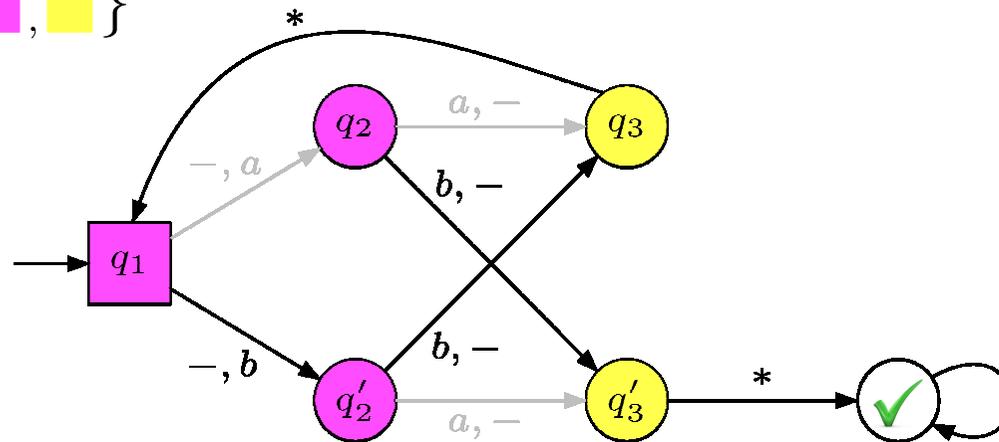
No pure strategy of Player 1 is winning with probability 1 (example from [CDHR06]).

# Randomization is necessary

Player 1 partial, player 2 perfect

$Obs_1 = \{ \text{pink square}, \text{yellow square} \}$

$$\sigma_i : Obs_i^+ \rightarrow \mathcal{D}(A_i)$$

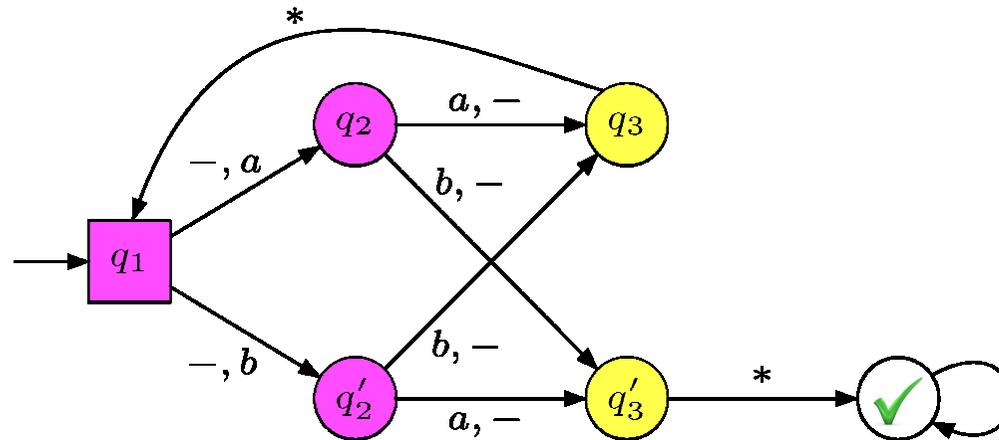


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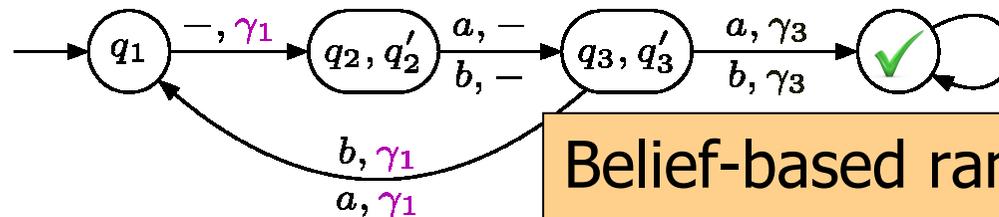
# Memory and Randomization

Player 1 partial, player 2 perfect

$$\sigma_i : \text{Obs}_i^+ \rightarrow \mathcal{D}(A_i)$$



Player 1 wins with probability 1, and needs **randomization**

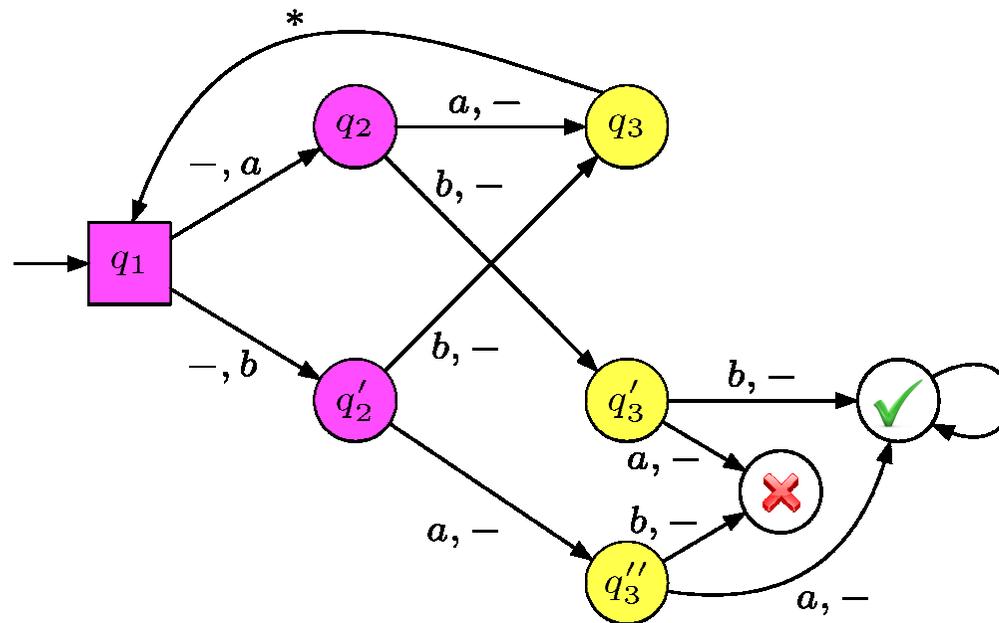


Belief-based randomized strategies are sufficient

# Example 2

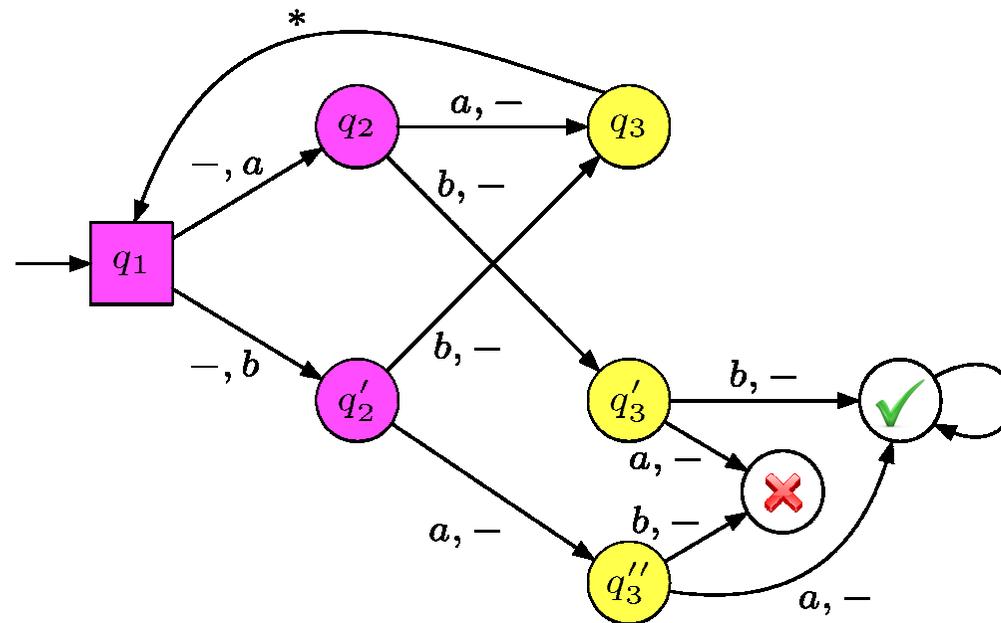
Player 1 partial, player 2 perfect

$$\sigma_i : \text{Obs}_i^+ \rightarrow \mathcal{D}(A_i)$$



# Example 2

Player 1 partial, player 2 perfect

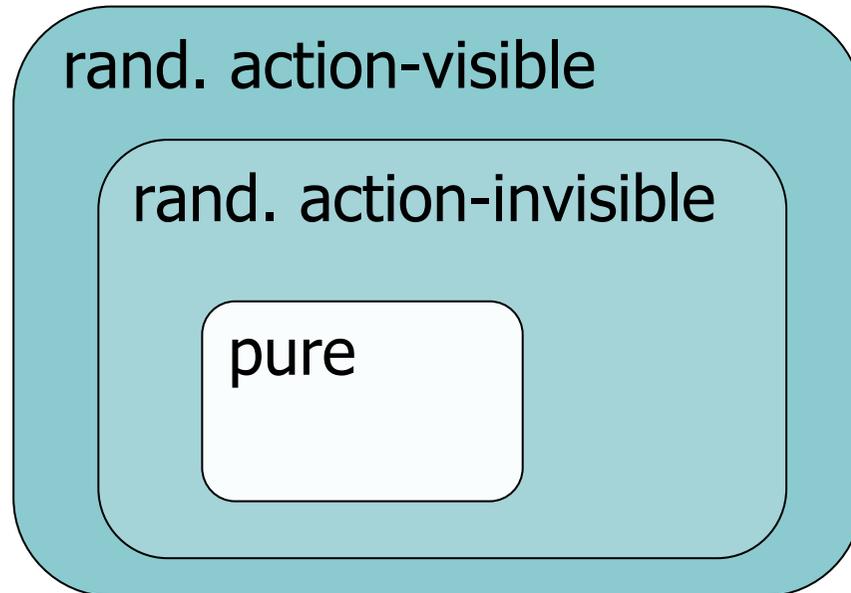


To win with probability 1, player 1 needs to observe his **own actions**. (example from [CDH10]).

Randomized **action-visible** strategies:  $\sigma_i : (\text{Obs}_i A_i)^* \text{Obs}_i \rightarrow \mathcal{D}(A_i)$

# Classes of strategies

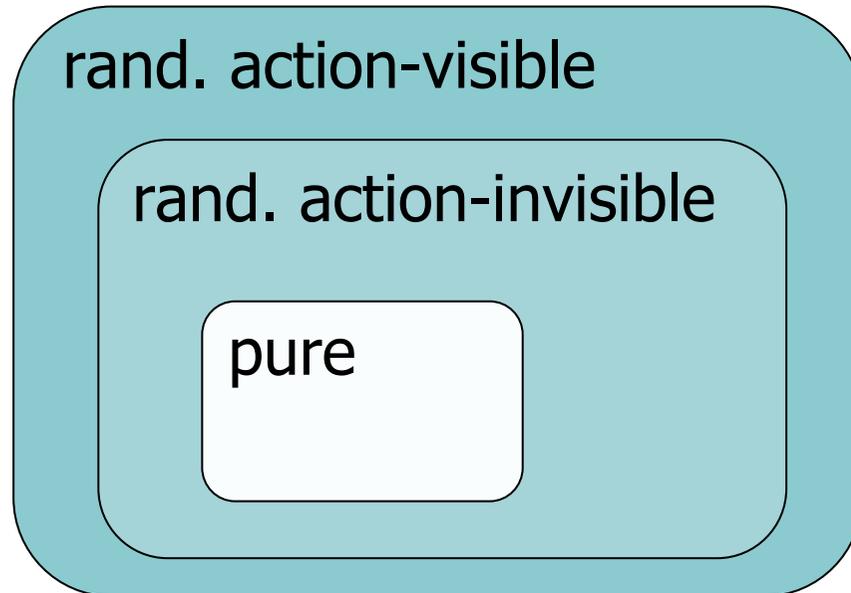
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Classification according to the power of strategies

# Classes of strategies

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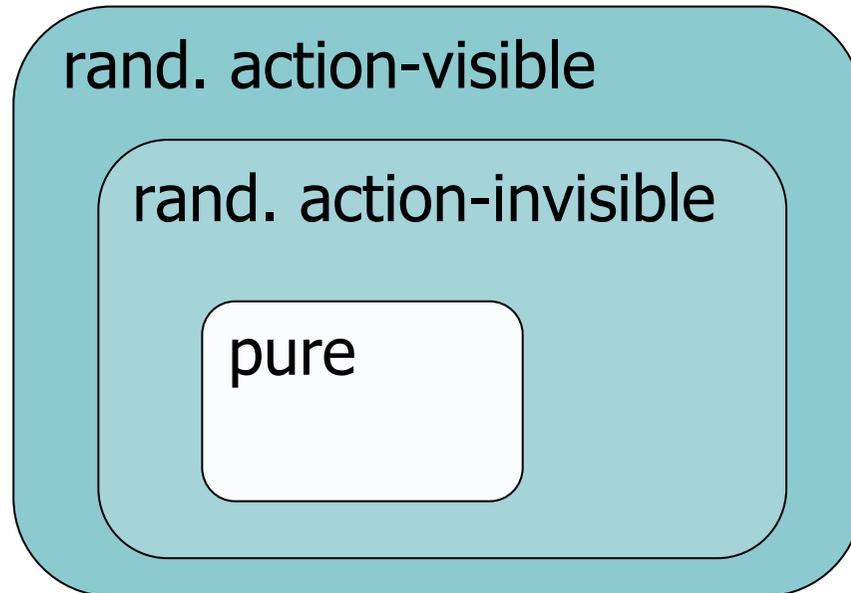
Classification according to the power of strategies

Poly-time reduction from decision problem of rand. act.-vis. to rand. act.-inv.

The model of rand. act.-inv. is more general

# Classes of strategies

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Classification according to the power of strategies

Computational complexity  
(algorithms)

Strategy complexity  
(memory)

# Known results

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Reachability - Memory requirement (for player 1)

<i>Almost-sure</i>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.			
rand. act.-inv.			
pure			

# Known results

Reachability - Memory requirement (for player 1)

<i>Almost-sure</i>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief) [CDHR'06(remark), GS'09]		exponential (belief) [GS'09]
pure	?	?	?

- [BGG09] Bertrand, Genest, Gimbert. *Qualitative Determinacy and Decidability of Stochastic Games with Signals*. LICS'09.  
[CDHR06] Chatterjee, Doyen, Henzinger, Raskin. *Algorithms for  $\omega$ -Regular games with Incomplete Information*. CSL'06.  
[GS09] Gripon, Serre. *Qualitative Concurrent Stochastic Games with Imperfect Information*. ICALP'09.

# Known results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief) [CDHR'06(remark), GS'09]		exponential (belief) [GS'09]
pure	?	?	?
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	?	?	?

# About beliefs

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Three prevalent beliefs:

- Belief is sufficient.
- Randomized action invisible or visible almost same.
- The general case memory is similar (or in some cases exponential blow up) as compared to the one-sided case.

# Pure Strategies

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## Belief

- Belief is sufficient.

## Proofs

- Doubts.

# Pure Strategies

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## Belief

- Belief is sufficient.

## Proofs

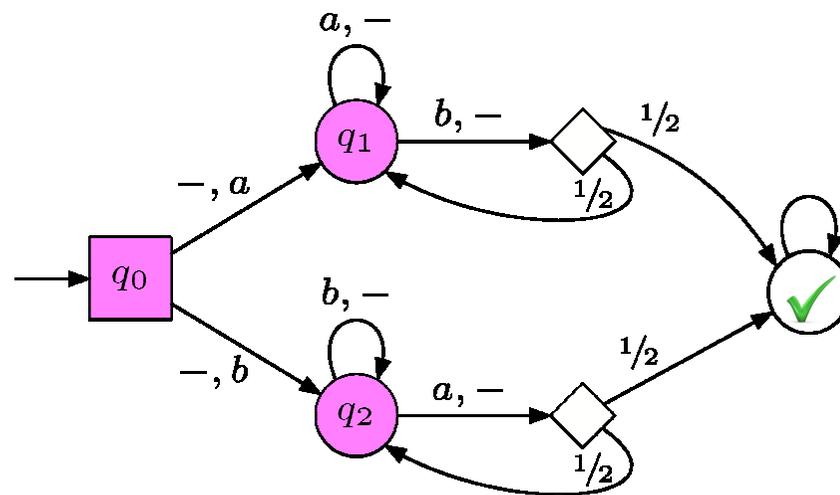
- Doubts.

## Lesson:

Doubt your belief and believe in your doubts !! See the unexpected.

# When belief fails (1/2)

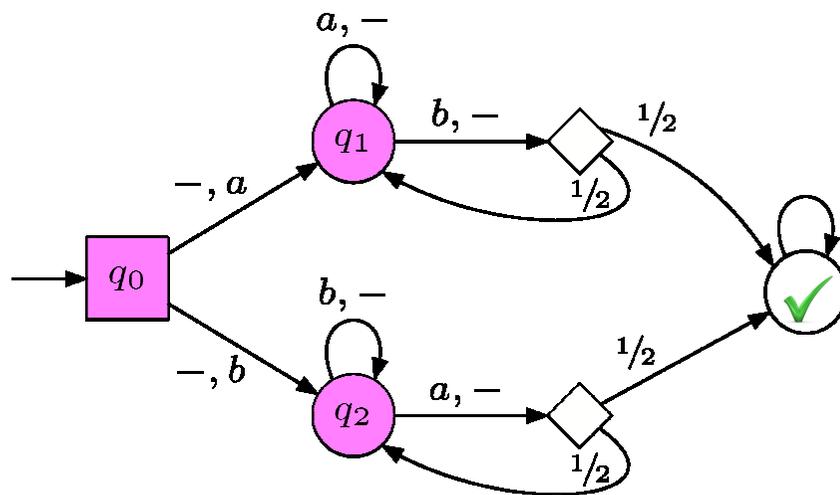
Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



player 1 partial  
player 2 perfect

# When belief fails (1/2)

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



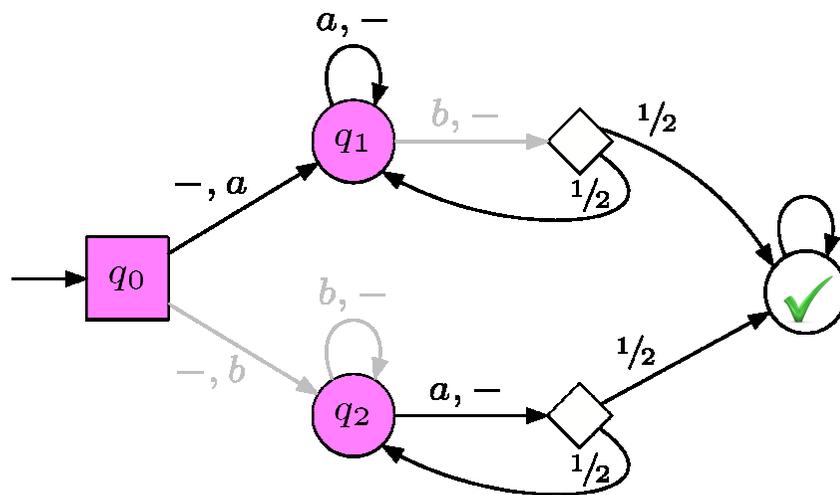
player 1 partial  
player 2 perfect

There are two belief-based-only pure strategies:

1. When belief is  $\{q_1, q_2\}$ , play  $a$
2. When belief is  $\{q_1, q_2\}$ , play  $b$

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Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



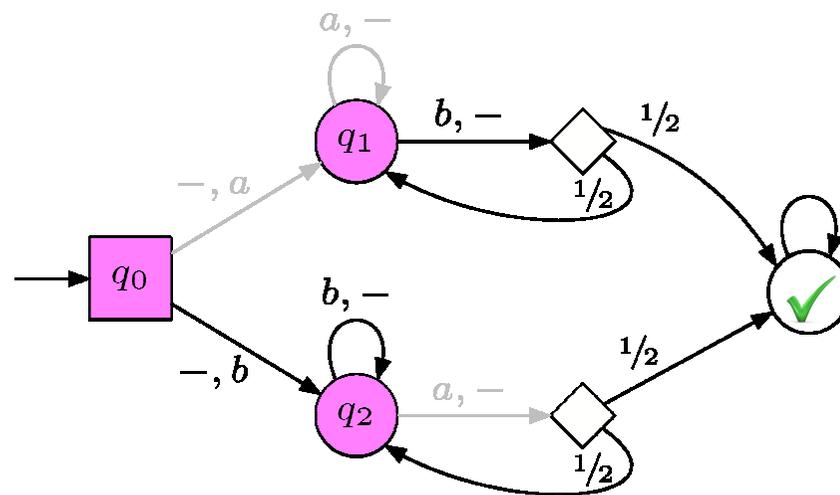
player 1 partial  
player 2 perfect

There are two belief-based-only pure strategies:

1. When belief is  $\{q_1, q_2\}$ , play  $a$  ← not winning
2. When belief is  $\{q_1, q_2\}$ , play  $b$

# When belief fails (1/2)

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



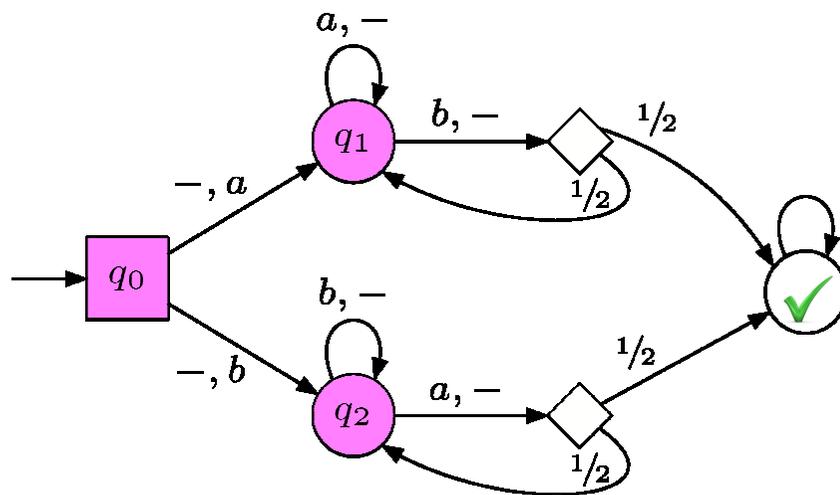
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# When belief fails (1/2)

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



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player 2 perfect

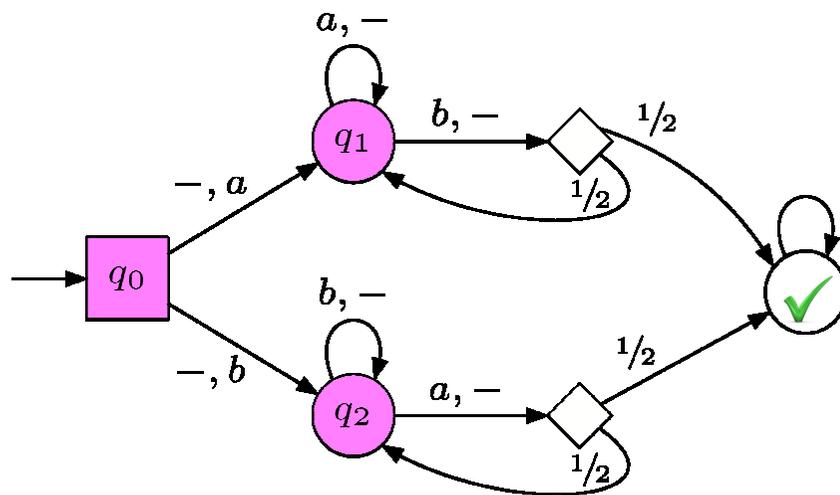
There are two belief-based-only pure strategies:

1. W
2. W

Neither is winning !

# When belief fails (1/2)

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning

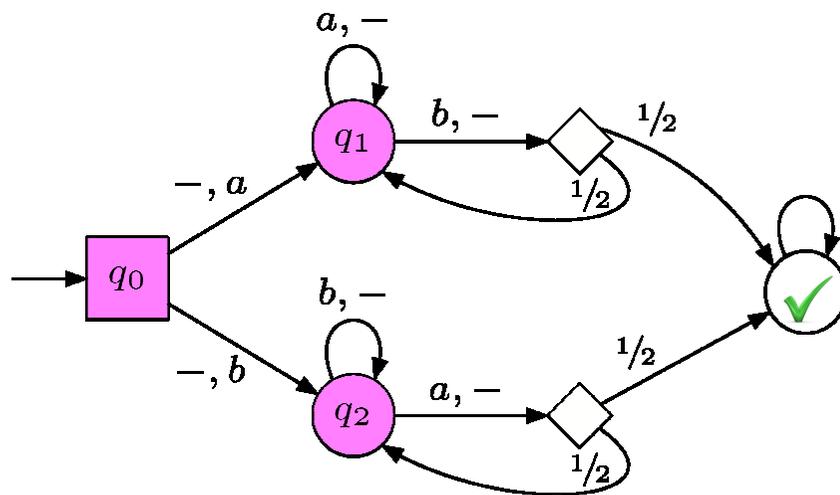


player 1 partial  
player 2 perfect

When belief is  $\{q_1, q_2\}$ , alternate  $a$  and  $b$

# When belief fails (1/2)

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



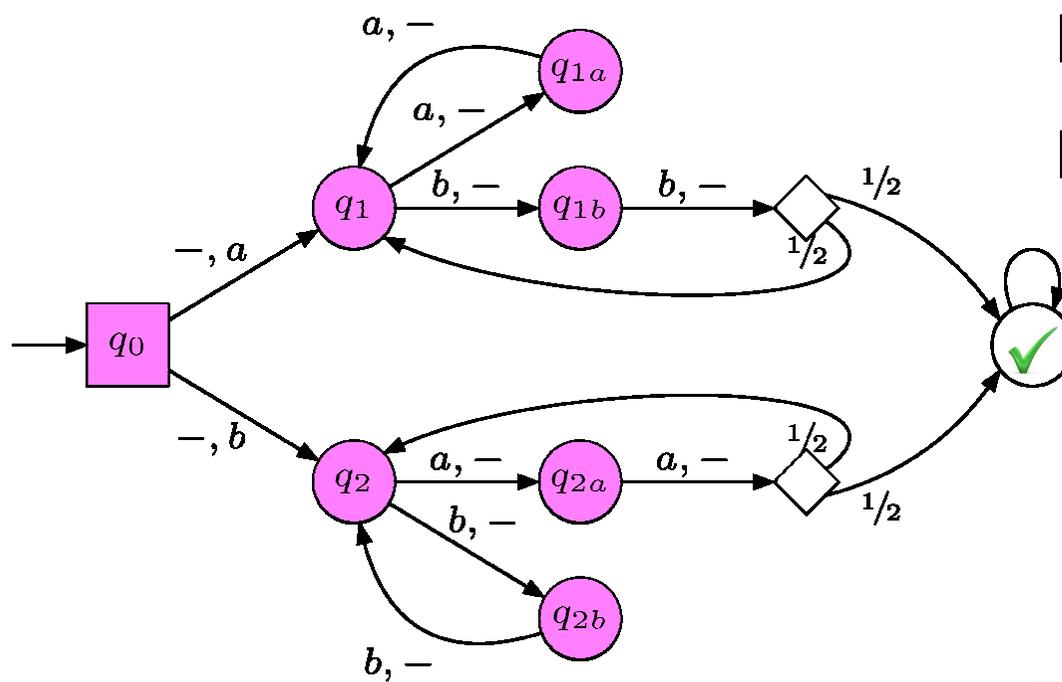
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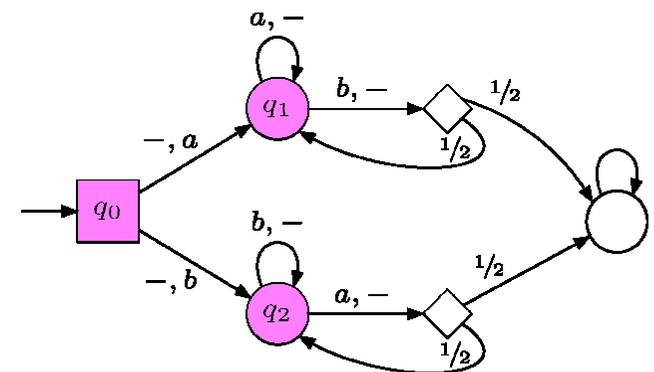
This strategy is almost-sure winning !

# When belief fails (2/2)

Using the trick of “repeated actions” we construct an example where belief-only randomized **action-invisible** strategies are not sufficient (for **almost-sure** winning)

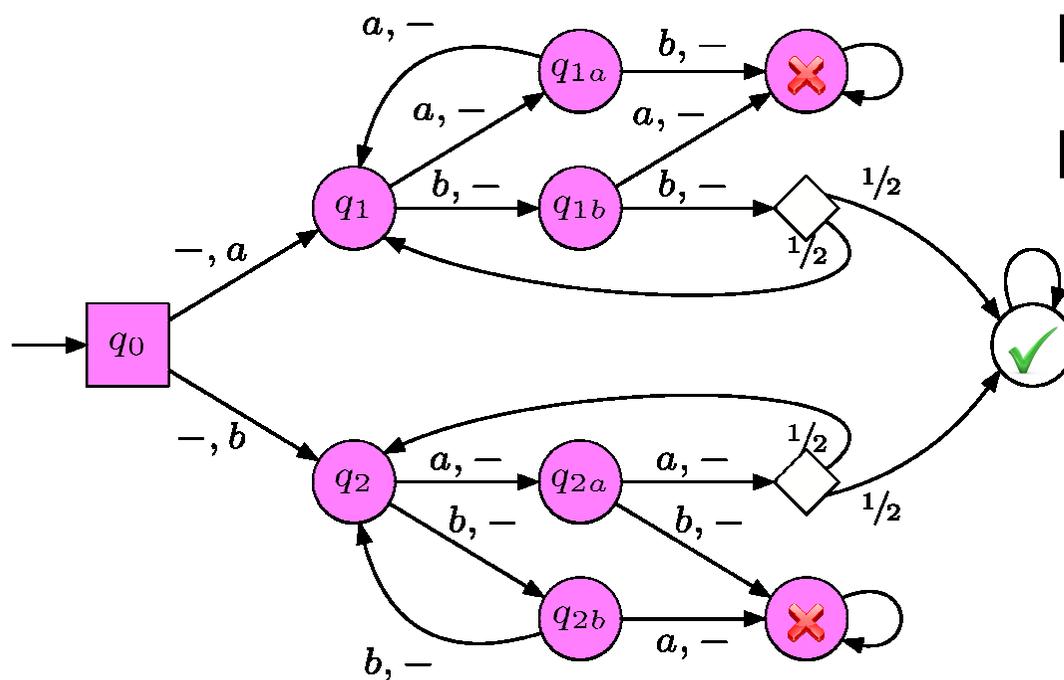


player 1 partial  
player 2 perfect



# When belief fails (2/2)

Using the trick of “repeated actions” we construct an example where belief-only randomized **action-invisible** strategies are not sufficient (for **almost-sure** winning)



player 1 partial  
player 2 perfect



# New results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief) [CDHR'06(remark), GS'09]		exponential (belief) [GS'09]
pure	?	?	?
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	?	?	?

# New results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		?
pure	exponential (belief not sufficient)	?	?
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	?	?

## Pure Strategies: Player 1 Perfect, Player 2 Partial

---

PI1 Perfect, PI 2 Partial :  
Stochastic, Randomized.  
Memoryless

PI1 Perfect, PI 2 Partial :  
Non-stochastic, Pure.  
Memoryless

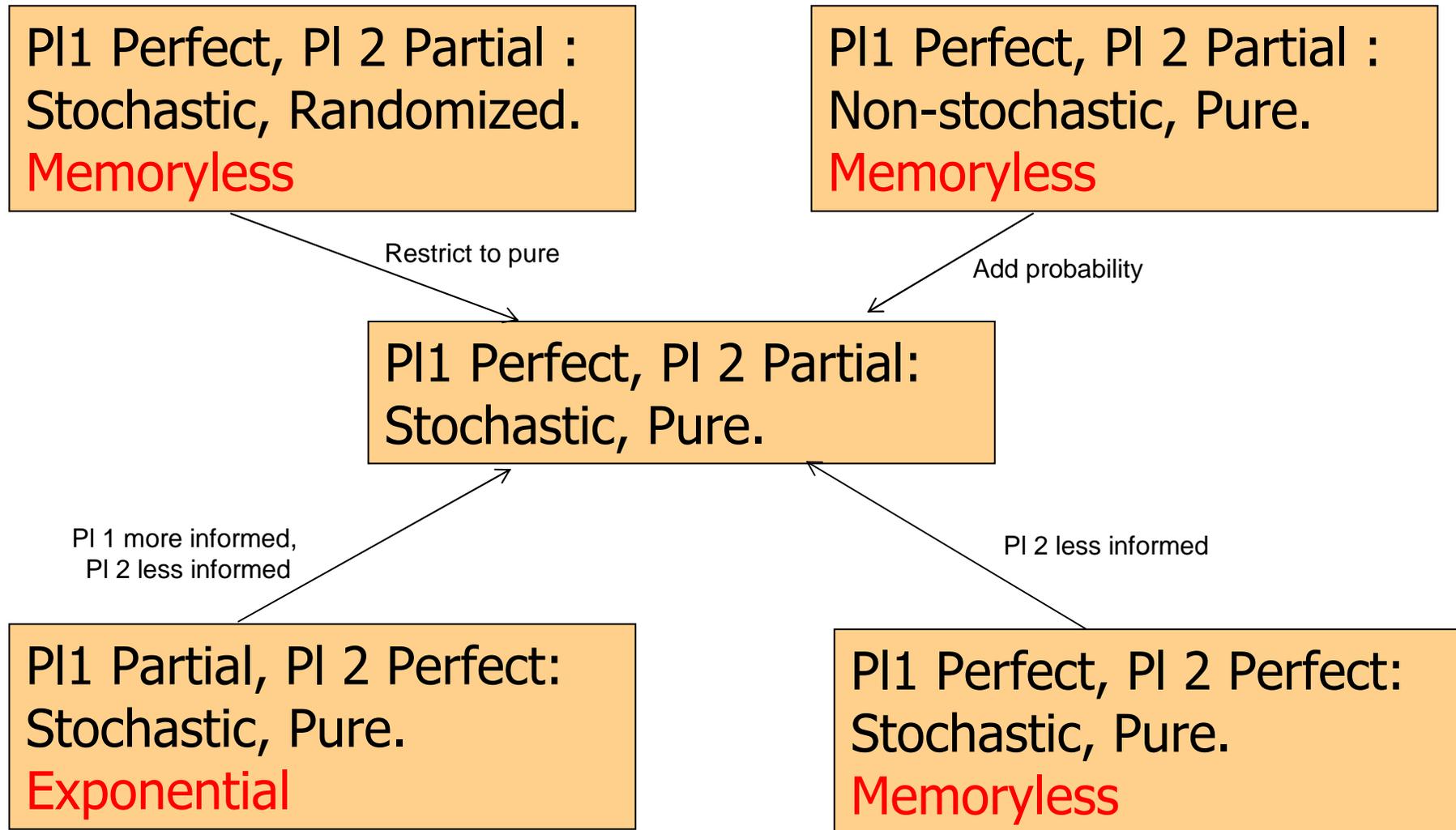
PI1 Perfect, PI 2 Partial:  
Stochastic, Pure.

PI1 Partial, PI 2 Perfect:  
Stochastic, Pure.  
Exponential

PI1 Perfect, PI 2 Perfect:  
Stochastic, Pure.  
Memoryless

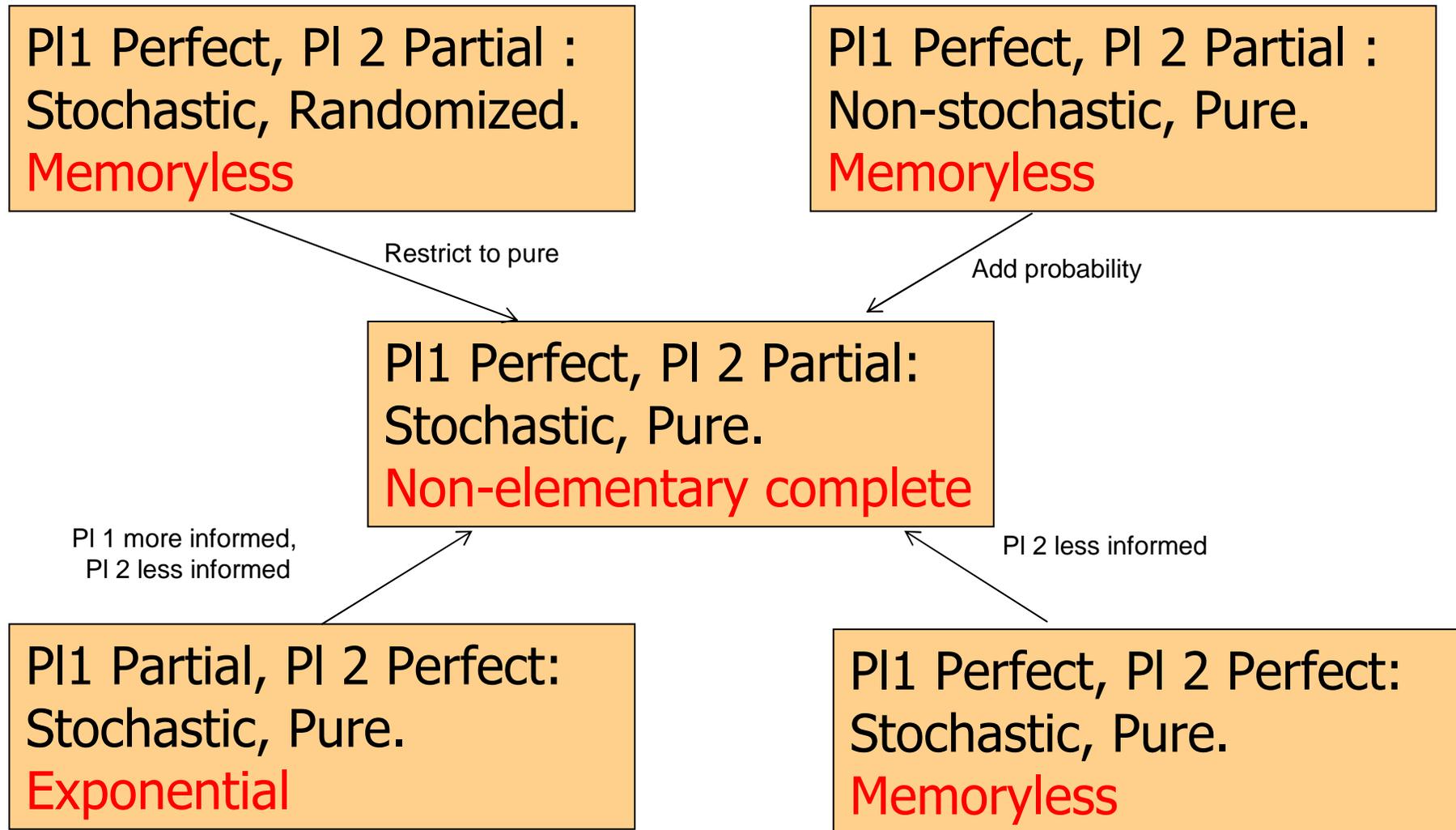
# Pure Strategies: Player 1 Perfect, Player 2 Partial

---



# Pure Strategies: Player 1 Perfect, Player 2 Partial

---



# New results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		?
pure	exponential (belief not sufficient)	non-elementary complete	?
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	?

# New results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		?
pure	exponential (belief not sufficient)	non-elementary complete	?
<b>Positive</b>	player 1 partial player 2 perfect	<div style="border: 1px solid black; background-color: #fde9d9; padding: 5px;">                     Player 1 wins from more states, but needs more memory !                 </div>	
rand. act.-vis.	memoryless		
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	?

# Player 1 perfect, player 2 partial

---

Memory of **non-elementary** size for pure strategies

- lower bound: simulation of counter systems with increment and division by 2
- upper bound:
  - positive**: non-elementary counters simulate randomized strategies
  - almost-sure**: reduction to iterated positive

Counter systems with  $\{+1, \div 2\}$  require non-elementary counter value for reachability  $2 \left. \begin{matrix} 2 \\ 2 \cdot 2 \\ \vdots \\ 2 \cdot 2 \end{matrix} \right\} \text{height } n$

# Player 1 perfect, player 2 partial

---

More information:

- Win from more places.
- Winning strategy is very hard to implement.

Information is useful, but ignorance is bliss 😊 !

# New results

Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		?
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)

# Pure $\equiv$ randomized-invisible

---

Equivalence of the decision problems for **almost-sure** reach with **pure** strategies and **rand. act.-inv.** strategies

- Reduction of rand. act.-inv. to pure choice of a subset of actions (support of prob. dist.)
- Reduction of pure to rand. act.-inv. repeated-action trick (holds for **almost-sure** only)

It follows that the memory requirements for pure hold for rand. act.-inv. as well !

# New results

## Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		finite (at least non- elementary)
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<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)

# Beliefs

---

Three prevalent beliefs:

- Belief is sufficient.
- Randomized action invisible or visible almost same.
- The general case memory is similar (or in some cases exponential blow up) as compared to the one-sided case.

Belief fails !

# Summary of our results

---

Pure strategies (for **almost-sure** and **positive**):

- player 1 partial: exponential memory, belief not sufficient
- player 1 perfect: non-elementary memory (complete)
- 2-sided: finite, at least non-elementary memory  
(as compared to previously claimed exponential upper bound)

Randomized action-invisible strategies (for **almost-sure**) :

- player 1 partial: exponential memory, belief not sufficient
- 2-sided: finite, at least non-elementary memory

# More results & open questions

---

Computational complexity for 1-sided:

- Player 1 partial: reduction to Büchi game, **EXPTIME-complete**
- Player 2 partial: non-elementary complexity  
(note: almost-sure Büchi is poly-time equivalent to almost-sure reachability,  
positive Büchi is undecidable [BBG08])

Open questions:

- Whether non-elementary size memory is sufficient in 2-sided
- Exact computational complexity

# Details

---

Details can be found in:

[CD11] Chatterjee, Doyen. *Partial-Observation Stochastic Games: How to Win when Belief Fails*. [CoRR abs/1107.2141](#), July 2011.

Extended abstract @ LICS'12:

[CD12] Chatterjee, Doyen. *Partial-Observation Stochastic Games: How to Win when Belief Fails*. [LICS'12](#), pp. 175-184, IEEE Press.

# References

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Other references:

[BBG08] Baier, Bertrand, Grösser. *On Decision Problems for Probabilistic Büchi automata*. **FoSSaCS'08**.

[BGG09] Bertrand, Genest, Gimbert. *Qualitative Determinacy and Decidability of Stochastic Games with Signals*. **LICS'09**.

[CDHR06] Chatterjee, Doyen, Henzinger, Raskin. *Algorithms for  $\omega$ -Regular games with Incomplete Information*. **CSL'06**.

[CDH10] Cristau, David, Horn. *How do we remember the past in randomised strategies?*. **GANDALF'10**.

[GS09] Gripon, Serre. *Qualitative Concurrent Stochastic Games with Imperfect Information*. **ICALP'09**.

[Paz71] Paz. *Introduction to Probabilistic Automata*. **Academic Press 1971**.

# Outline

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- Game Model: example
- Challenges & Results: examples
- Solution insights: examples

# Some proof ideas

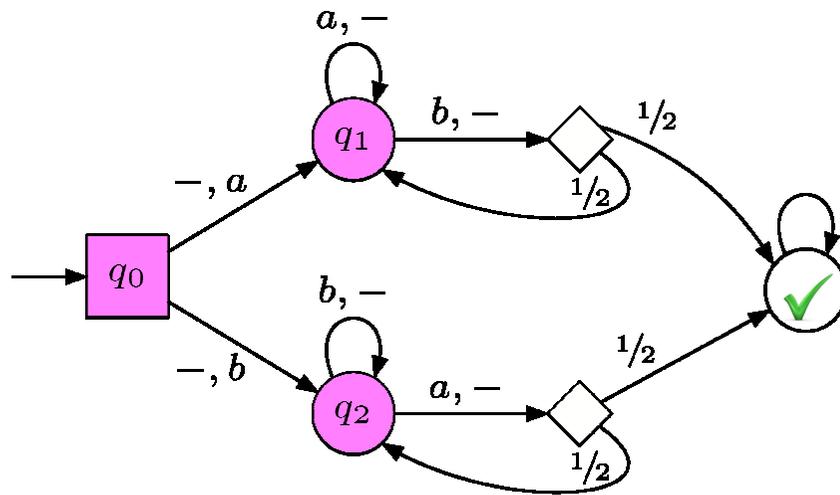
# New results

## Reachability - Memory requirement (for player 1)

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pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)

# When belief fails

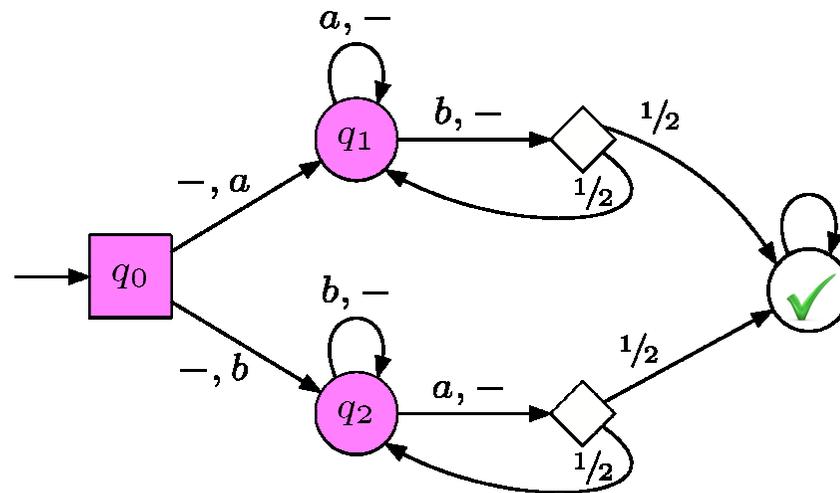
Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning



player 1 partial  
player 2 perfect

# When belief fails

Belief-based-only **pure** strategies are **not sufficient**, both for positive and for almost-sure winning

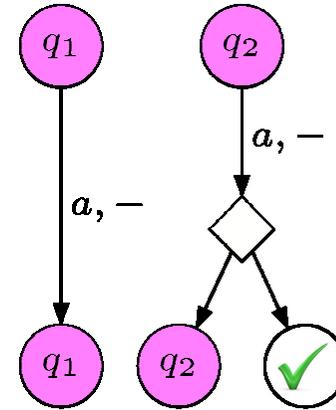
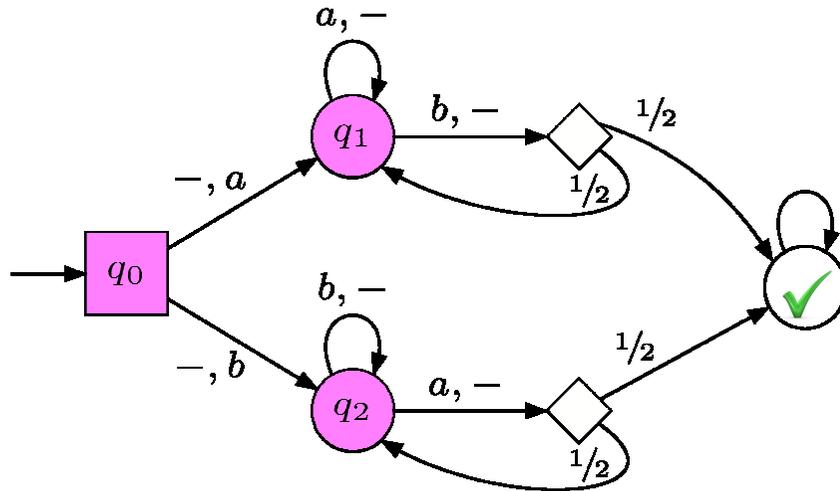


player 1 partial  
player 2 perfect



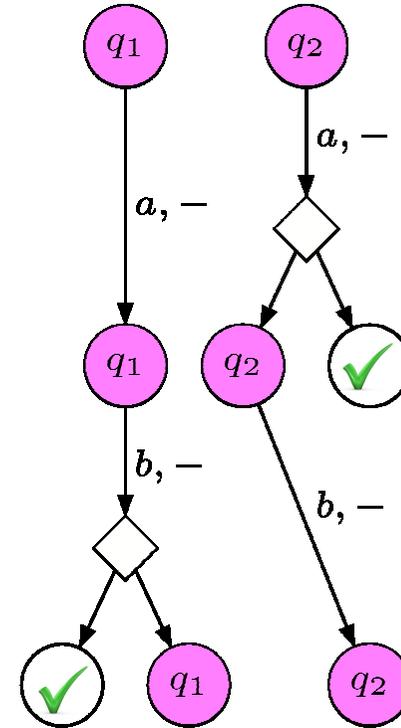
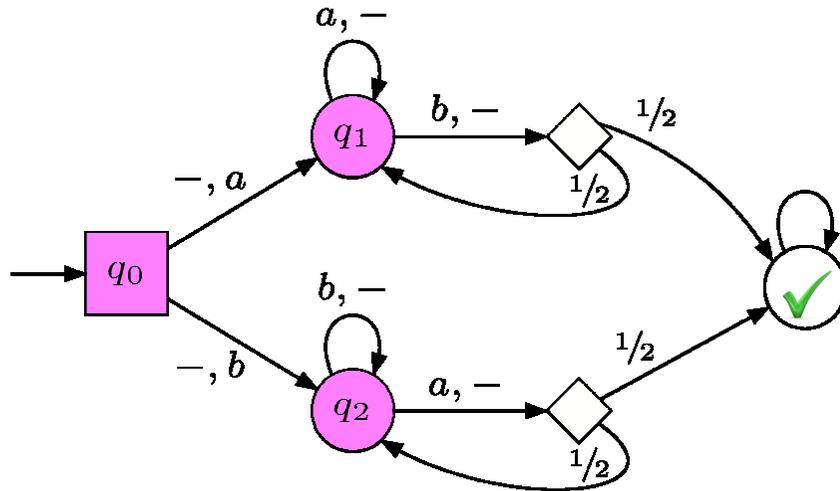
When belief is  $\{q_1, q_2\}$ , then ensure that the target is reached from **both**  $q_1$  and  $q_2$ .

# When belief fails



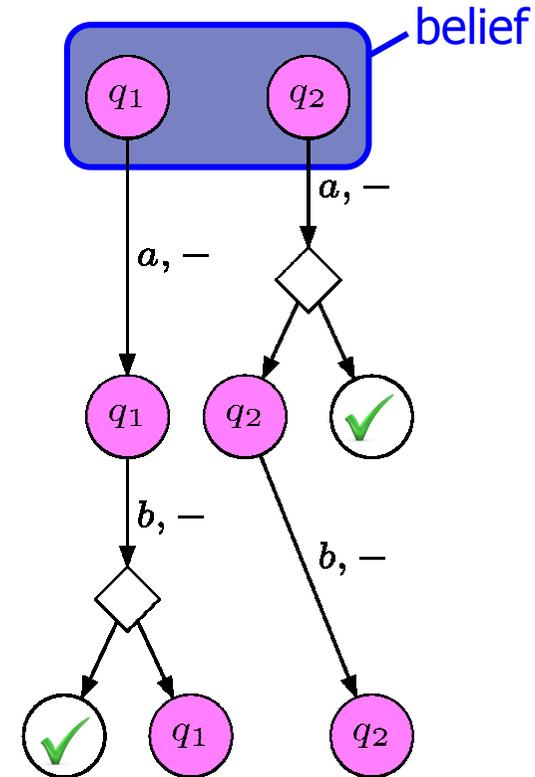
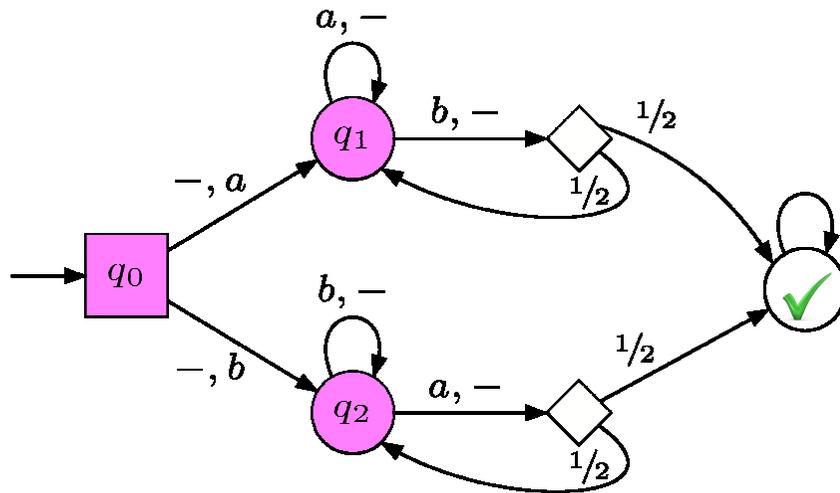
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# When belief fails



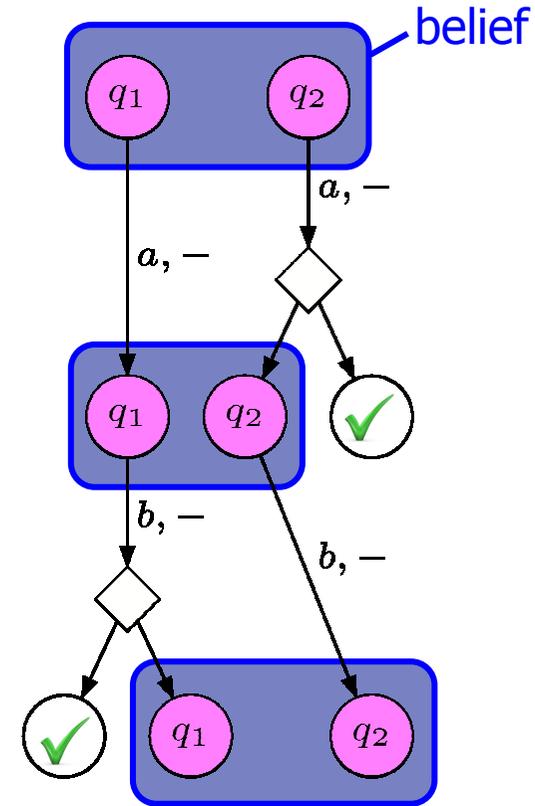
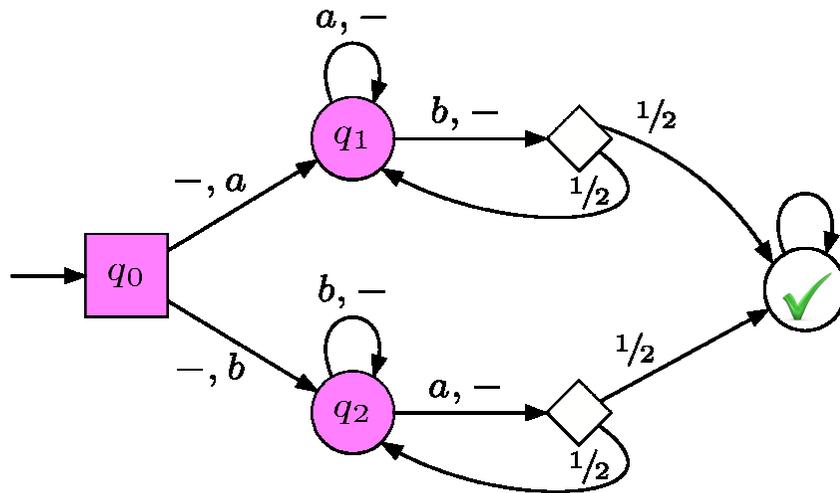
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# When belief fails



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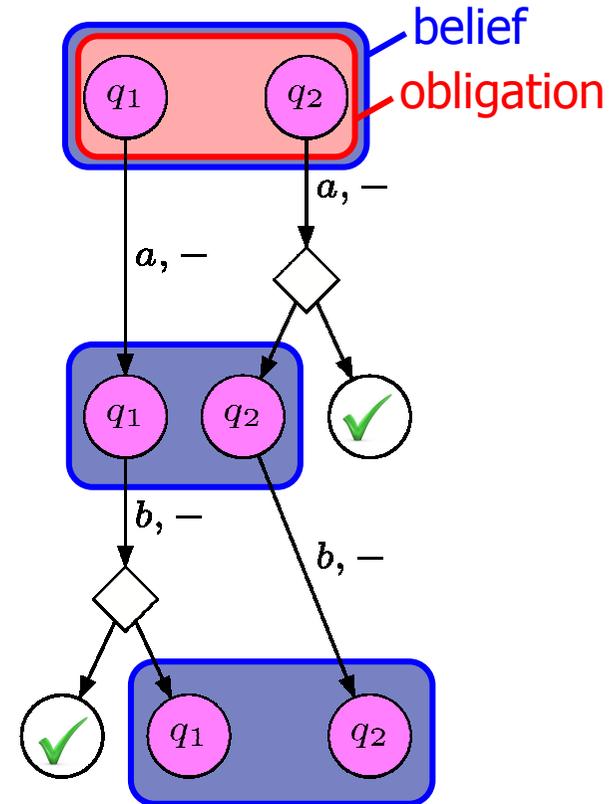
# When belief fails



When belief is  $\{q_1, q_2\}$ , then ensure that the target is reached from **both**  $q_1$  and  $q_2$ .

# When belief fails

**Obligation** = from every state in belief, reach target with **positive** probability

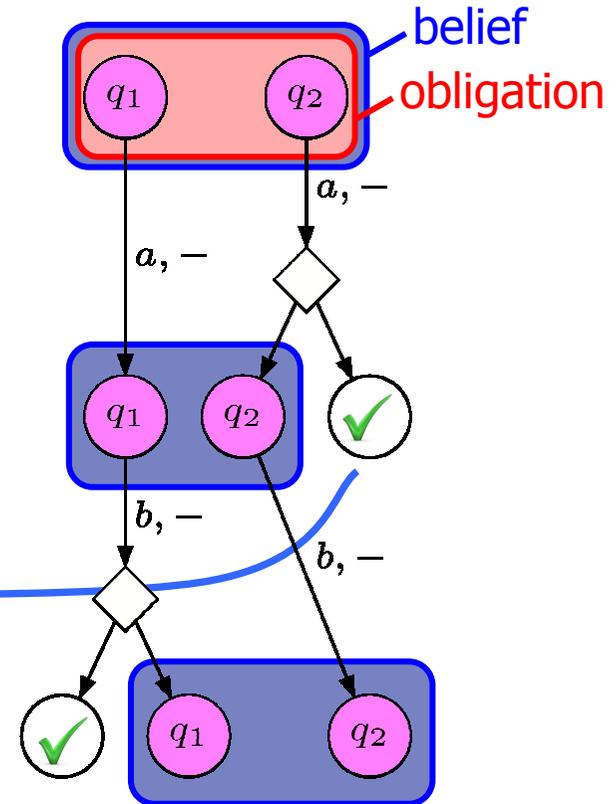


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**Obligation** = from every state in belief, reach target with **positive** probability

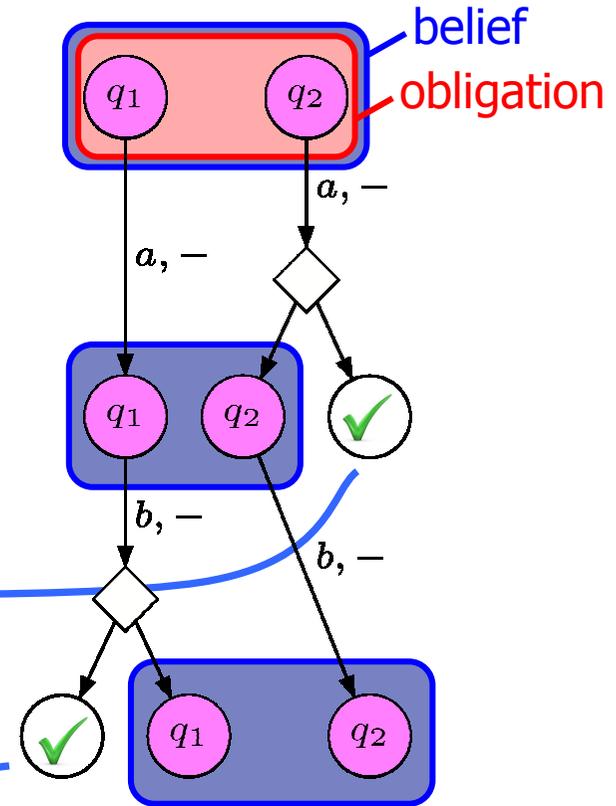
At this point, obligation of  $q_2$  is satisfied



When belief is  $\{q_1, q_2\}$ , then ensure that the target is reached from **both**  $q_1$  and  $q_2$ .

# When belief fails

**Obligation** = from every state in belief, reach target with **positive** probability



At this point, obligation of  $q_2$  is satisfied

Here, obligation of  $q_1$  is satisfied



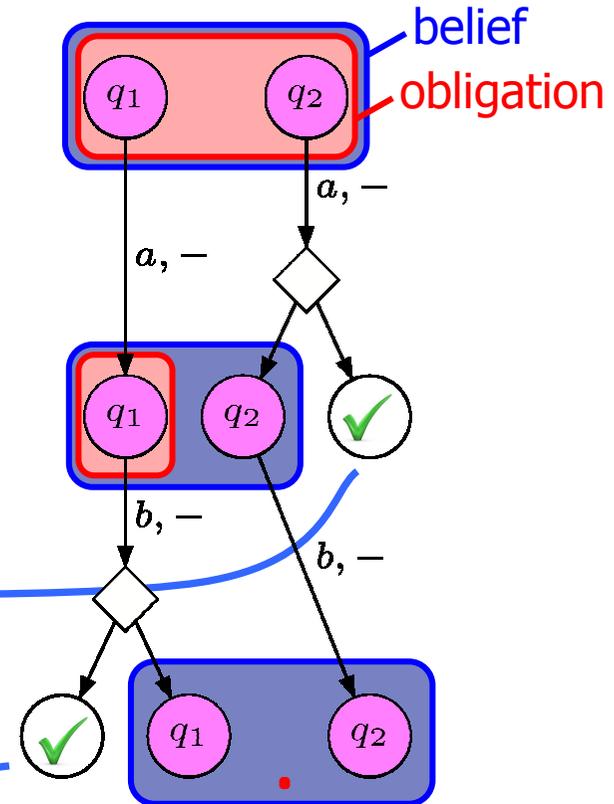
When belief is  $\{q_1, q_2\}$ , then ensure that the target is reached from **both**  $q_1$  and  $q_2$ .

# When belief fails

**Obligation** = from every state in belief, reach target with **positive** probability

At this point, obligation of  $q_2$  is satisfied

Here, obligation of  $q_1$  is satisfied



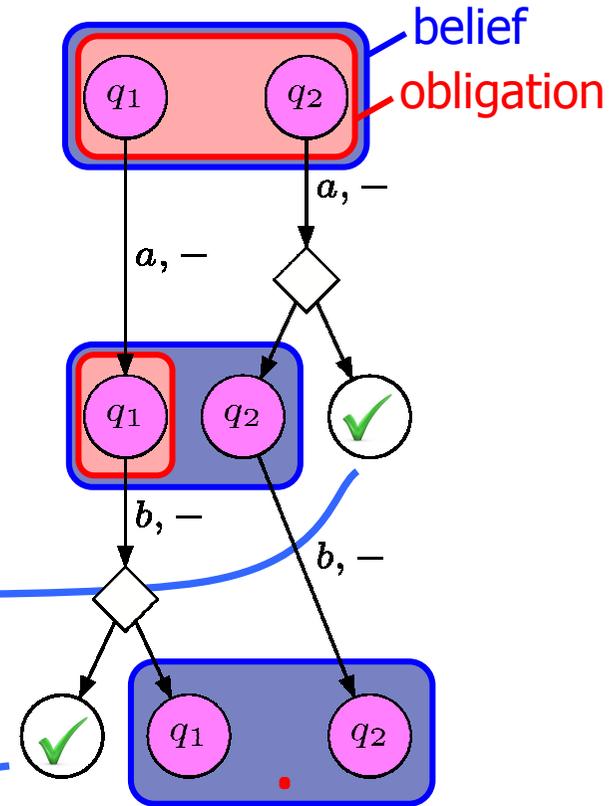
When belief is  $\{q_1, q_2\}$ , then ensure that the target is reached from **both**  $q_1$  and  $q_2$ .

# When belief fails

**Obligation** = from every state in belief, reach target with **positive** probability

At this point, obligation of  $q_2$  is satisfied

Here, obligation of  $q_1$  is satisfied



Empty obligation set



All obligations fulfilled

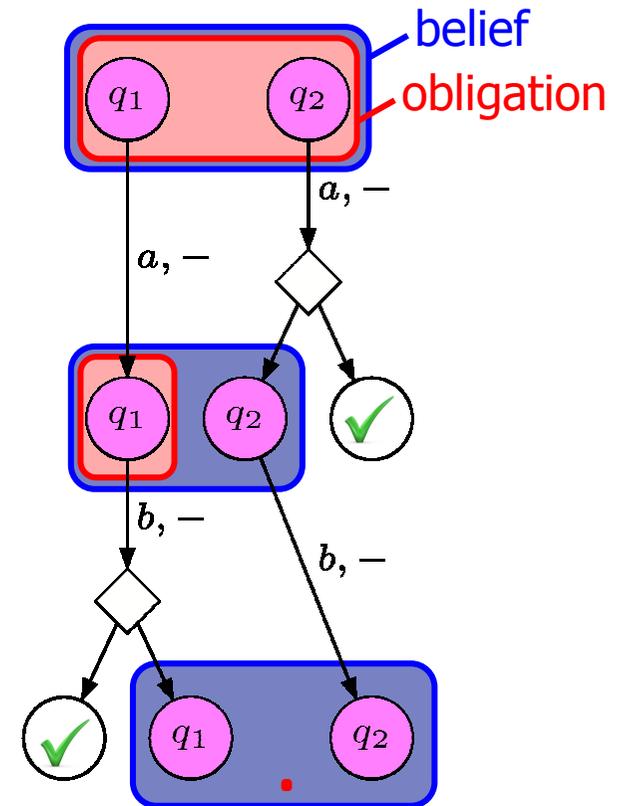
# When belief fails

**Positive** reachability: ensure empty obligation once

## Reachability condition

**Almost-sure** reachability: ensure empty obligation infinitely often (and recharge when empty)

## Büchi condition



Empty obligation set



All obligations fulfilled

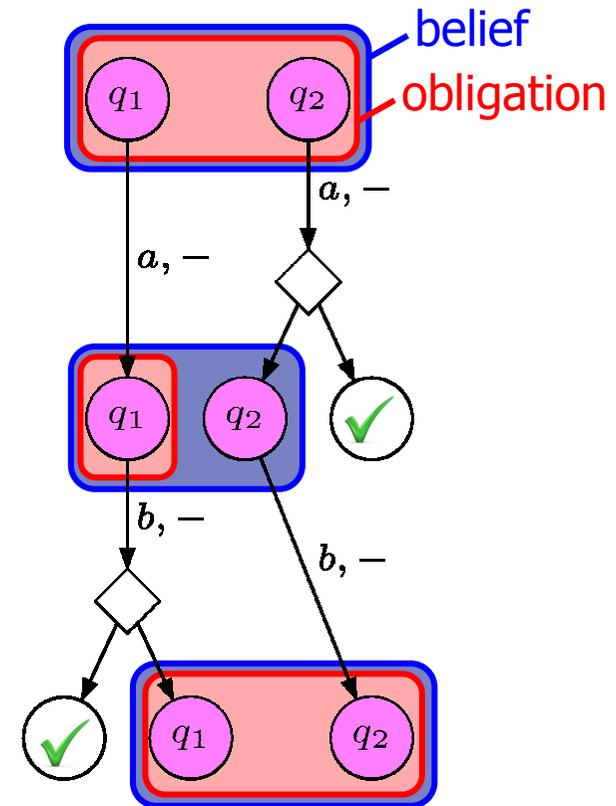
# When belief fails

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All obligations fulfilled

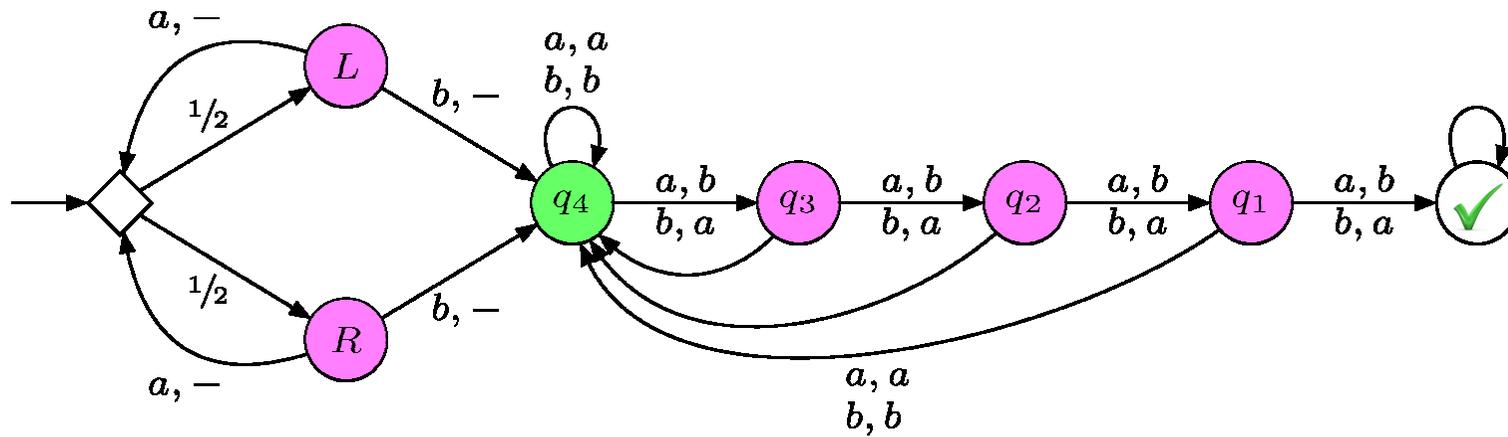
# New results

## Reachability - Memory requirement (for player 1)

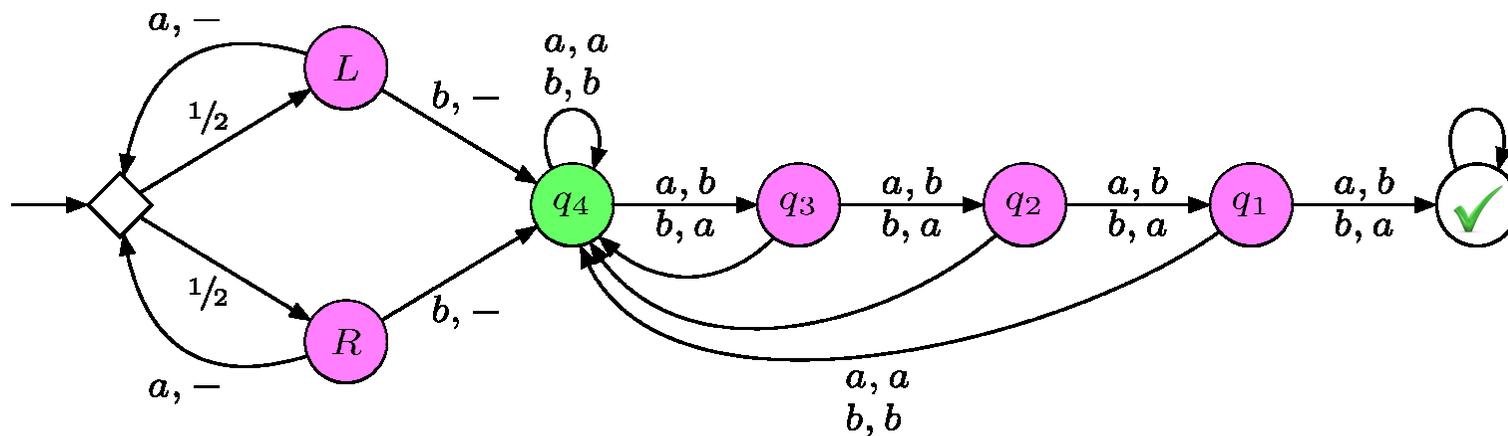
<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		finite (at least non- elementary)
pure	exponential (belief not sufficient)	<b>non-elementary complete</b>	finite (at least non- elementary)
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	<b>non-elementary complete</b>	finite (at least non- elementary)

# Player 1 perfect, player 2 partial

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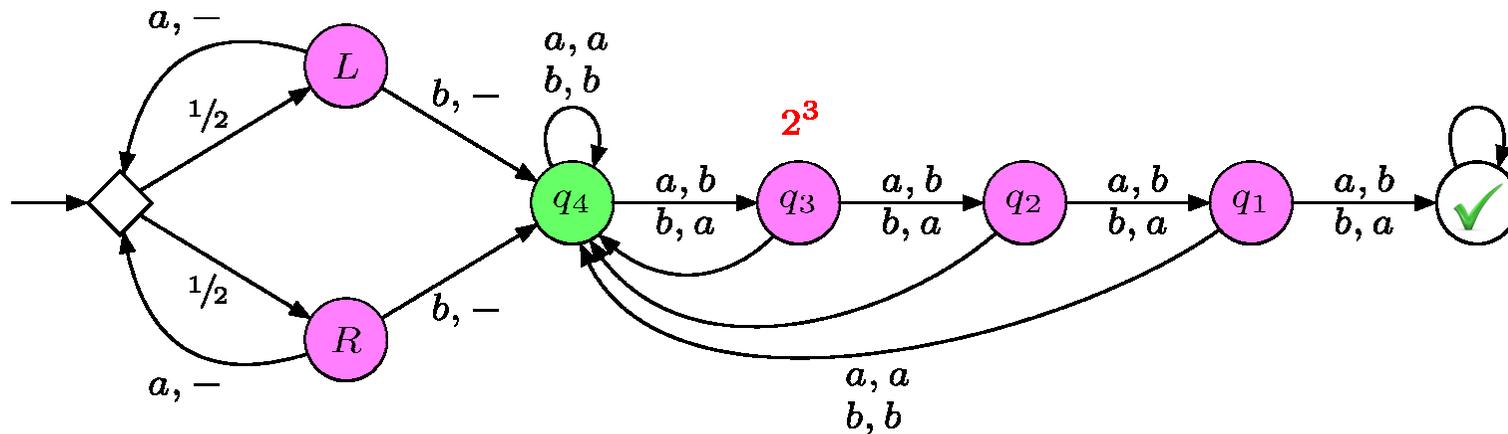


# Player 1 perfect, player 2 partial



1. Play 3 times  $a$  to generate  $2^4$  indistinguishable paths  
(with observation ■■■■)
2. Play  $b$ , then in  $q_4$  play  $a$  over half of the paths  $L\bar{L}\bar{L}\bar{L}$  or the rest
3. In  $q_i$ , play analogously, and ensure  $2^{i-1}$  paths  $LLLR_1$   
 $LLRL$
4. Reach  $q_0$  with positive probability  $LLRR$   
 $LRL\bar{L}$   
...

# Player 1 perfect, player 2 partial

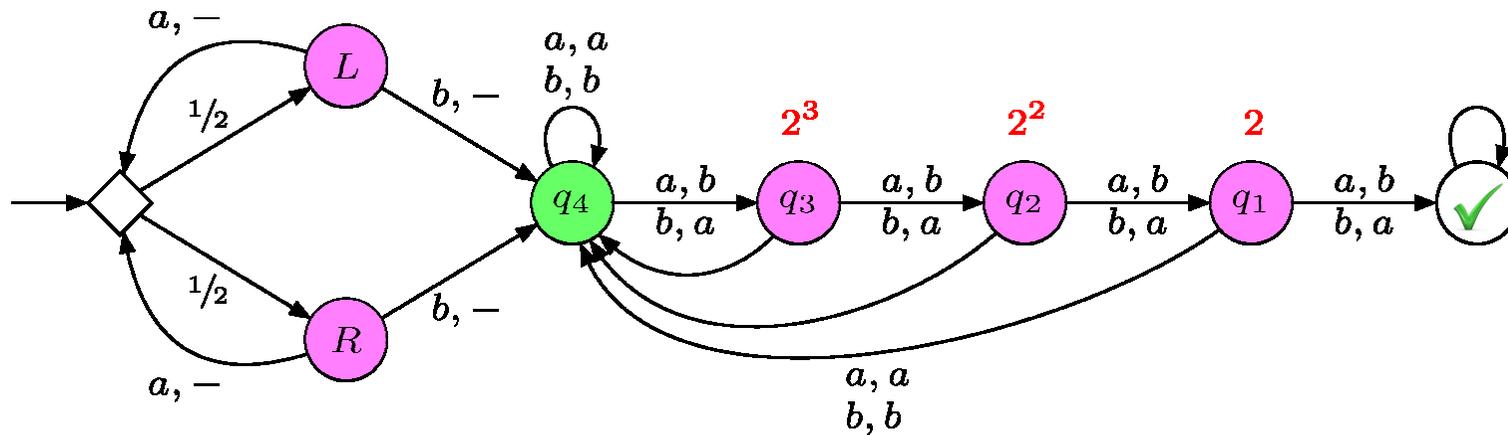


1. Play 3 times  $a$  to generate  $2^4$  indistinguishable paths
2. Play  $b$ , then in  $q_4$  play  $a$  over half of the paths,  $b$  over the rest
3. In  $q_i$ , play analogously, and ensure  $2^{i-1}$  paths
4. Reach  $q_0$  with positive probability

$LLLLq_4$   
 $LLLRq_4$   
 $LLRLq_4$

$\dots$

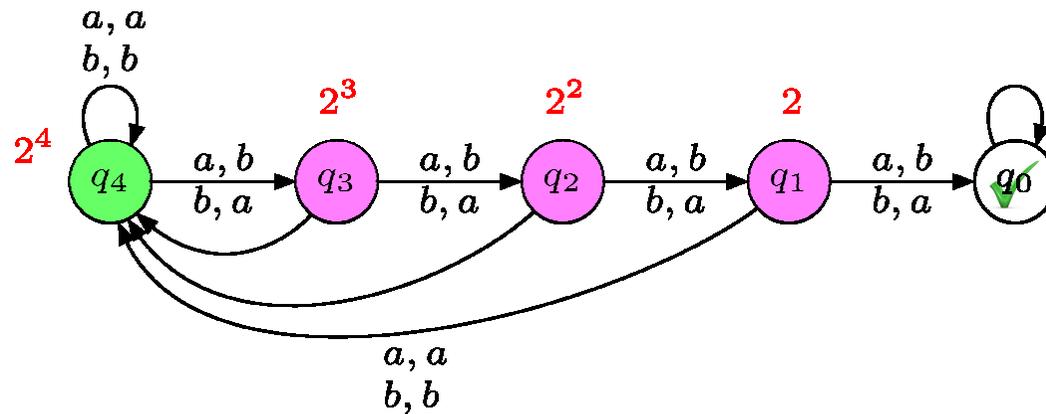
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1. Play 3 times  $a$  to generate  $2^4$  indistinguishable paths
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3. In  $q_i$ , play analogously, and ensure  $2^{i-1}$  paths in  $q_{i-1}$
4. Reach  $q_0$  with positive probability

# Player 1 perfect, player 2 partial

- LLLLq<sub>4</sub>
  - LLLRq<sub>4</sub>
  - LLRLq<sub>4</sub>
  - LLRRq<sub>4</sub>
  - LRLLq<sub>4</sub>
  - LRLRq<sub>4</sub>
  - LRRLq<sub>4</sub>
  - LRRRq<sub>4</sub>
  - RLLLq<sub>4</sub>
  - RLLRq<sub>4</sub>
  - RLRLq<sub>4</sub>
  - RLRRq<sub>4</sub>
  - RRLq<sub>4</sub>
  - RRLRq<sub>4</sub>
  - RRRLq<sub>4</sub>
  - RRRRq<sub>4</sub>
- 

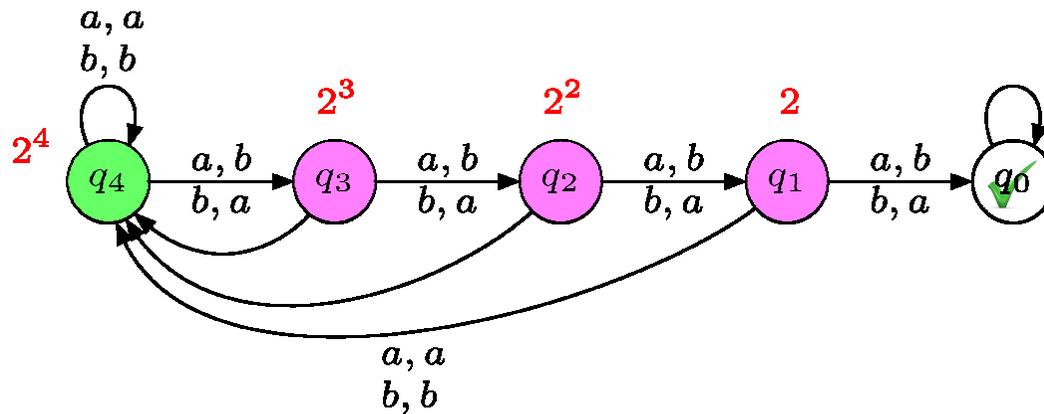


# Player 1 perfect, player 2 partial

- $LLLLq_4$
- $LLLRq_4$
- $LLRLq_4$
- $LLRRq_4$
- $LRLLq_4$
- $LRLRq_4$
- $LRRLq_4$
- $LRRRq_4$
- $RLLLq_4$
- $RLLRq_4$
- $RLRLq_4$
- $RLRRq_4$
- $RRLLq_4$
- $RRLRq_4$
- $RRRLq_4$
- $RRRRq_4$

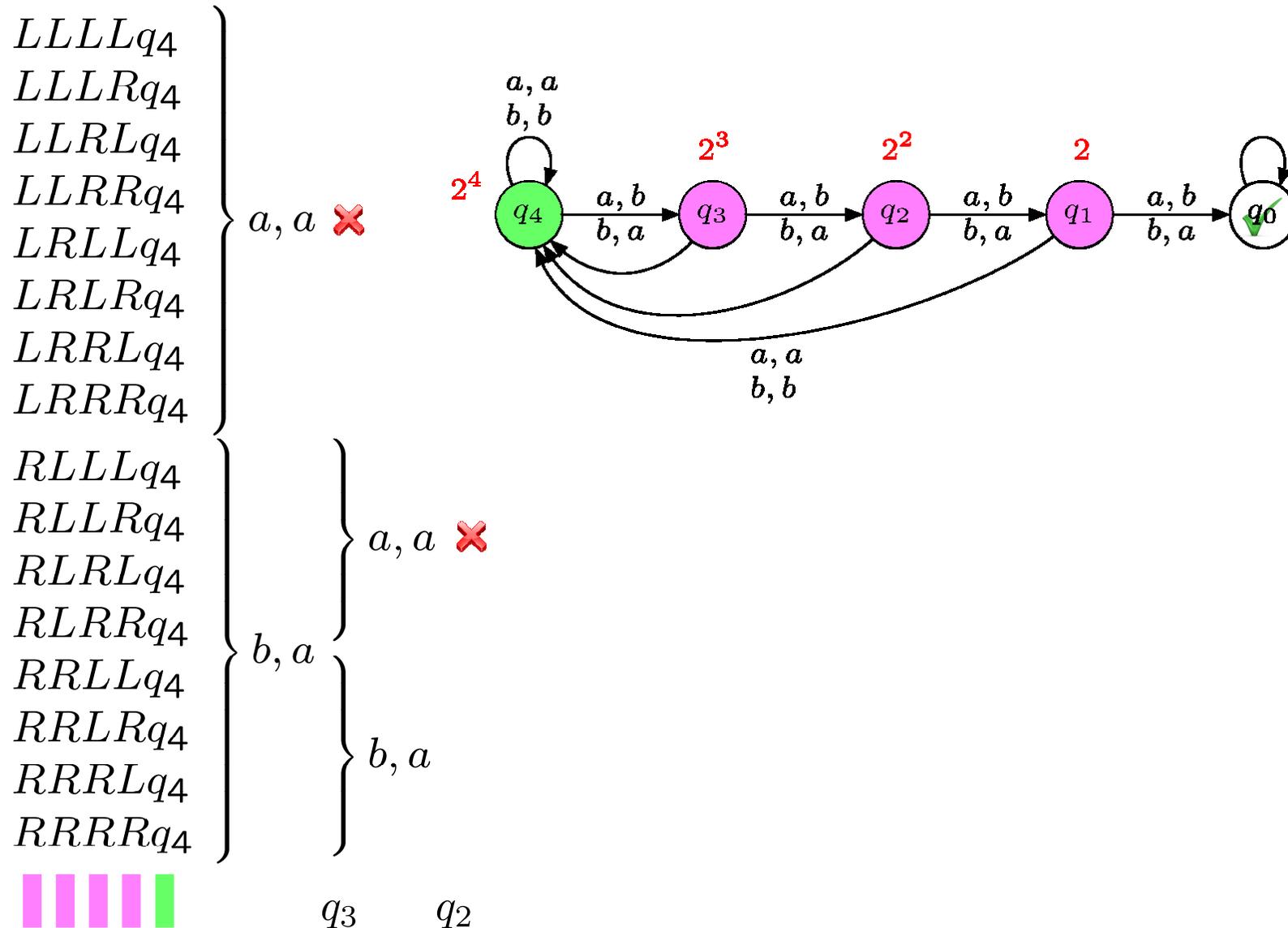
$a, a$  ✖

$b, a$



$q_3$

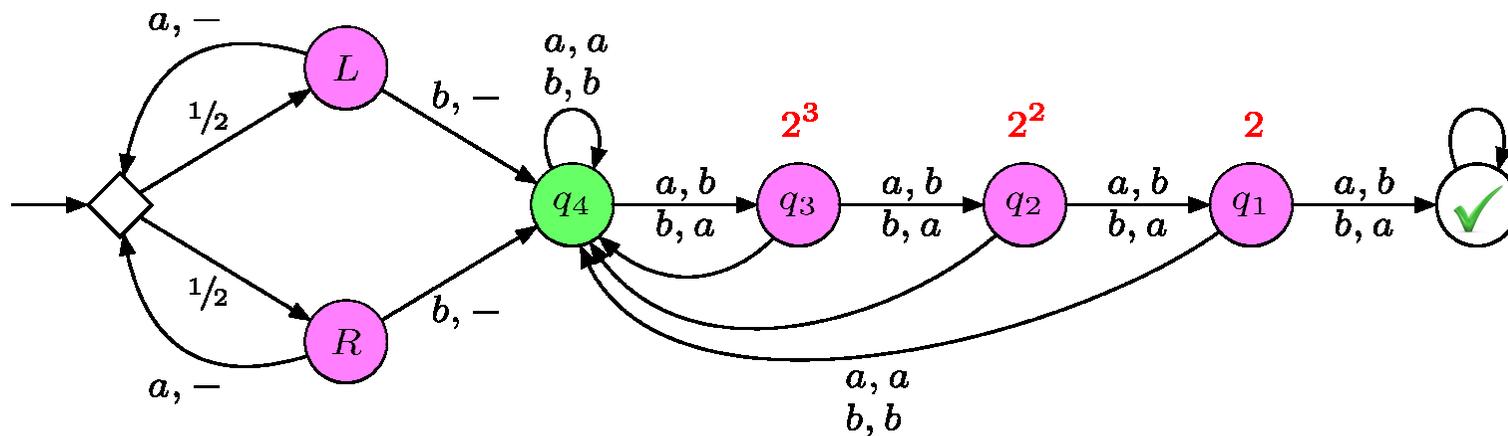
# Player 1 perfect, player 2 partial





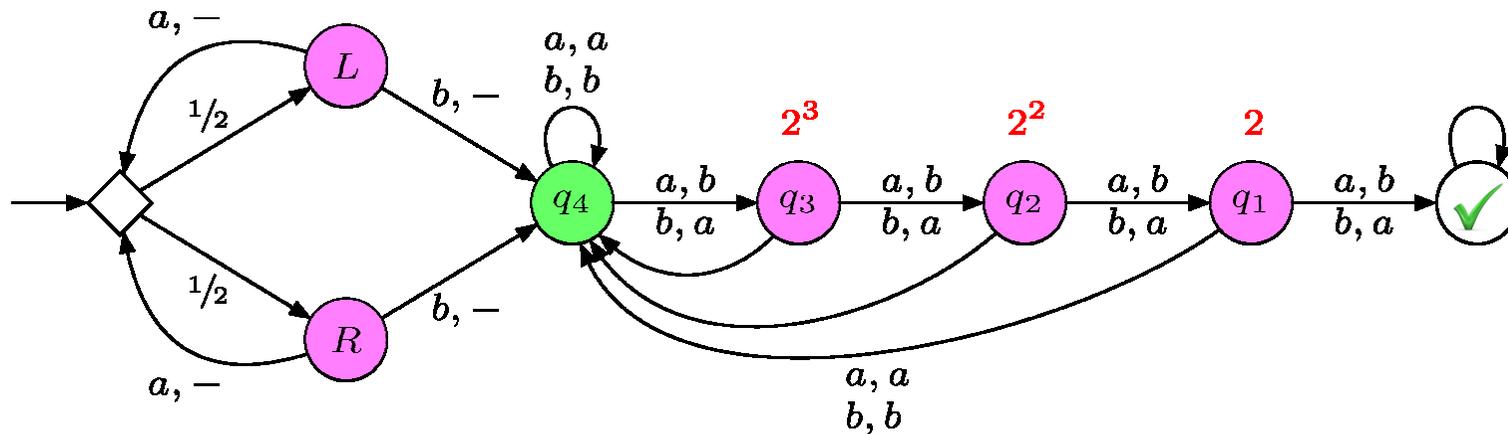


# Player 1 perfect, player 2 partial



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3. In  $q_i$ , play analogously, and ensure  $2^{i-1}$  paths in  $q_{i-1}$
4. Reach  $q_0$  with positive probability ...

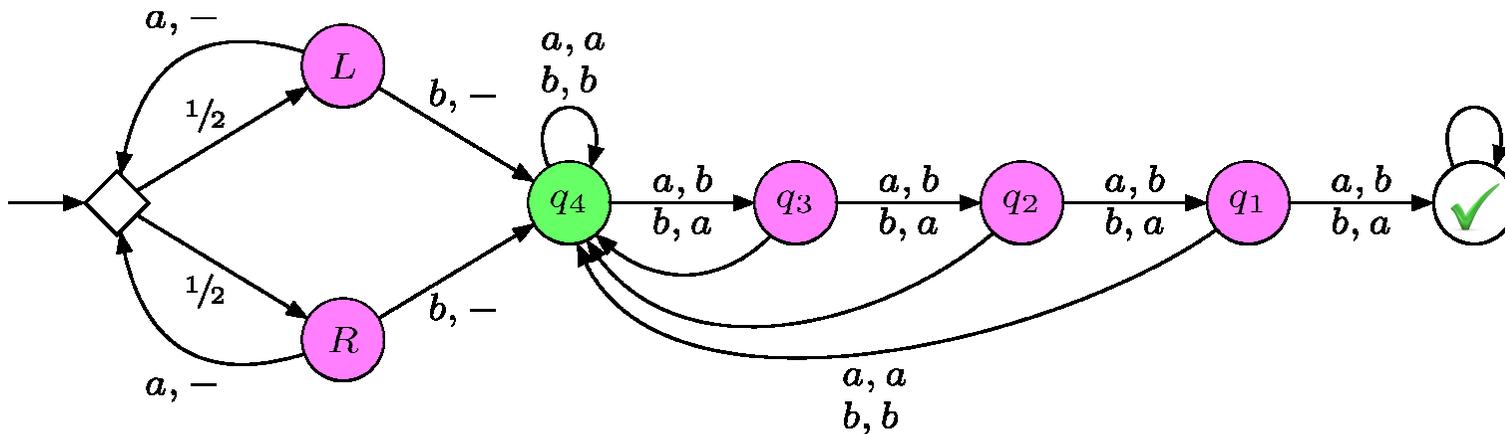
# Player 1 perfect, player 2 partial



1. Play 3 times  $a$  to generate  $2^4$  indistinguishable paths
2. Play  $b$ , then in  $q_4$  play  $a$  over half of the paths,  $b$  over the rest
3. In  $q_i$ , play analogously, and ensure  $2^{i-1}$  paths in  $q_{i-1}$
4. Reach  $q_0$  with positive probability ...  
... using exponential memory

# Player 1 perfect, player 2 partial

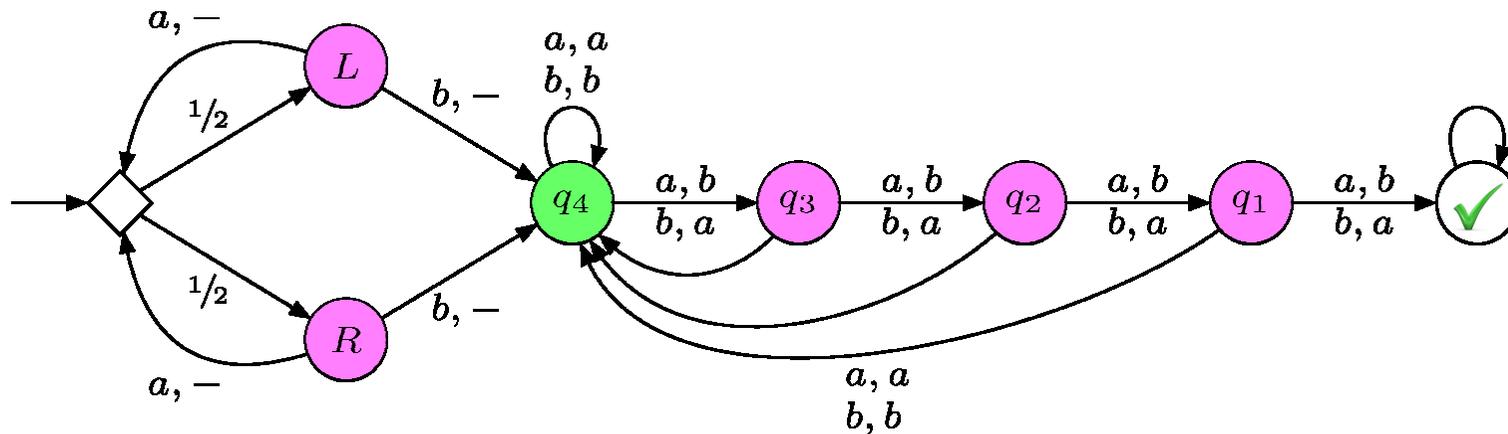
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Flavor of a counter system with:

- **increment**,
- **division by 2** (size of alphabet)

# Player 1 perfect, player 2 partial



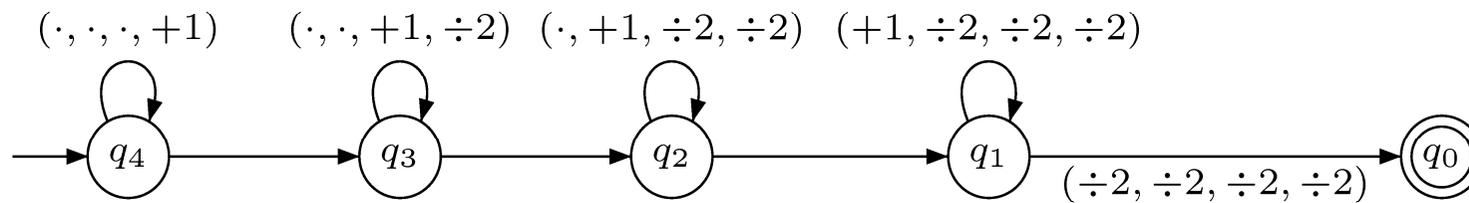
Show that:

1. games can simulate **increment** and **division by 2**
2. Such counter systems require non-elementary counter value for reachability

$$2^{\left. \begin{matrix} 2 \\ 2 \cdot 2 \end{matrix} \right\} \text{height } n}$$

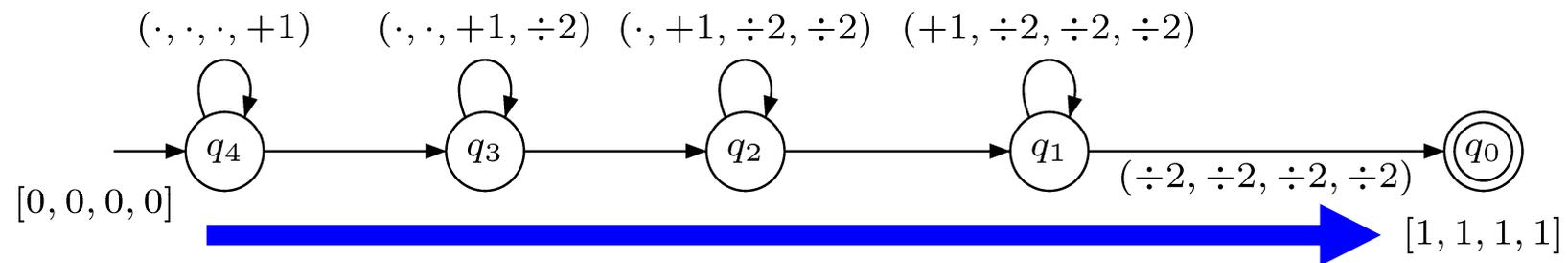
# Counter system with $\{+1, \div 2\}$

---



# Counter system with $\{+1, \div 2\}$

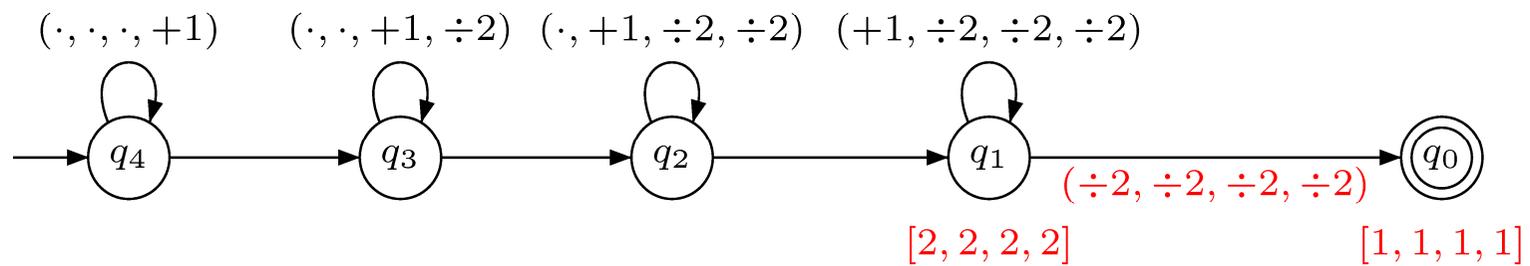
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Reachability ?

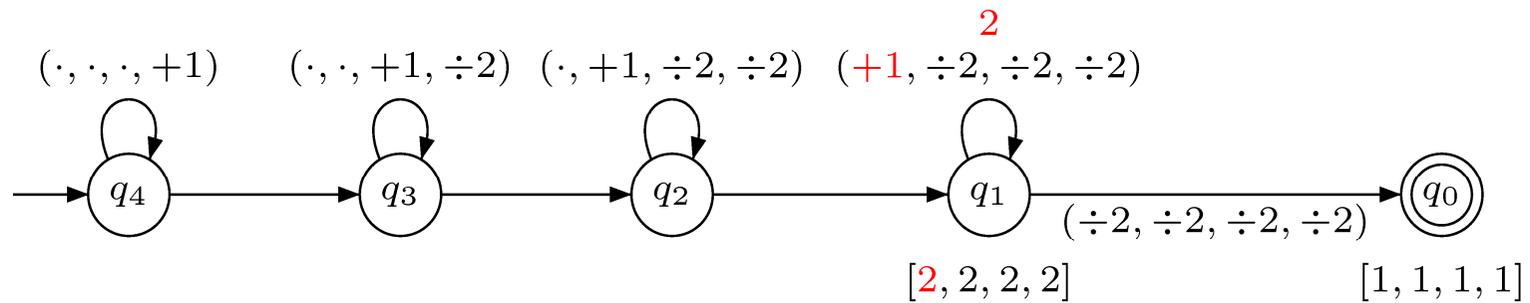
# Counter system with $\{+1, \div 2\}$

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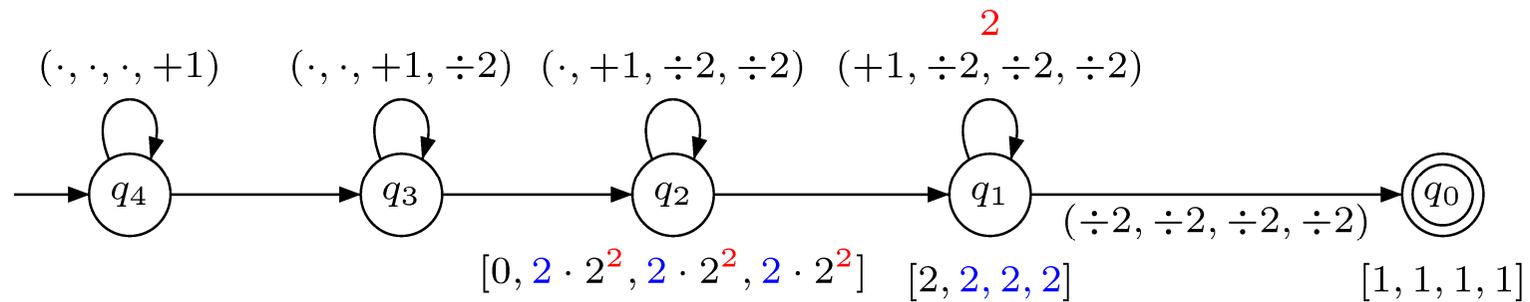
# Counter system with $\{+1, \div 2\}$

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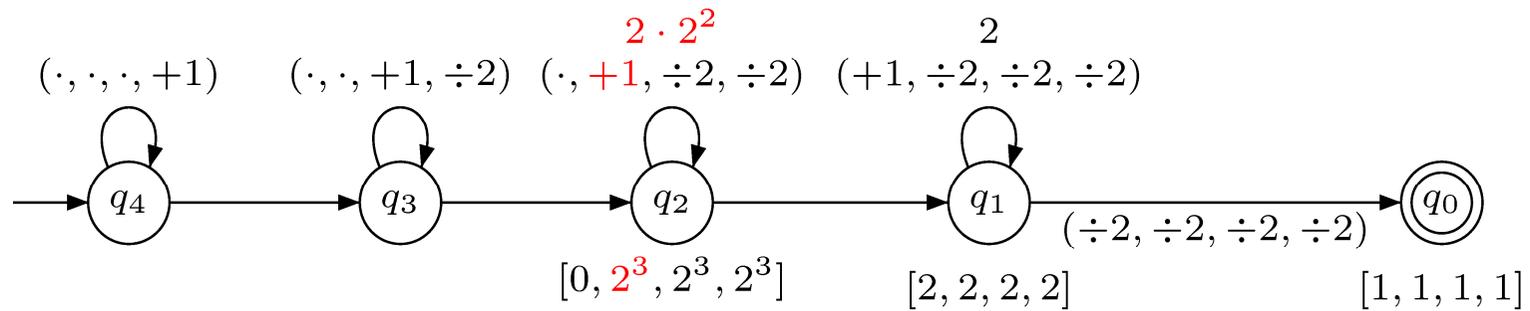
# Counter system with $\{+1, \div 2\}$

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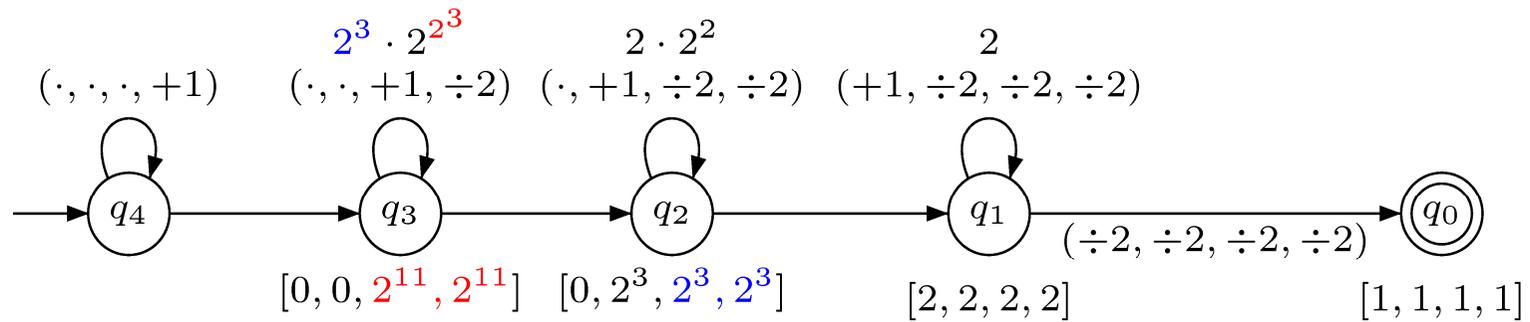
# Counter system with $\{+1, \div 2\}$

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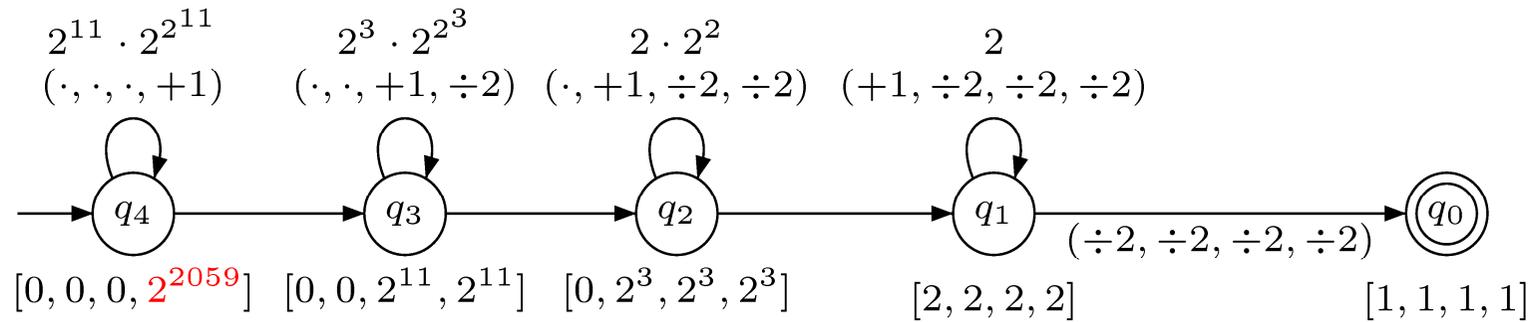
# Counter system with $\{+1, \div 2\}$

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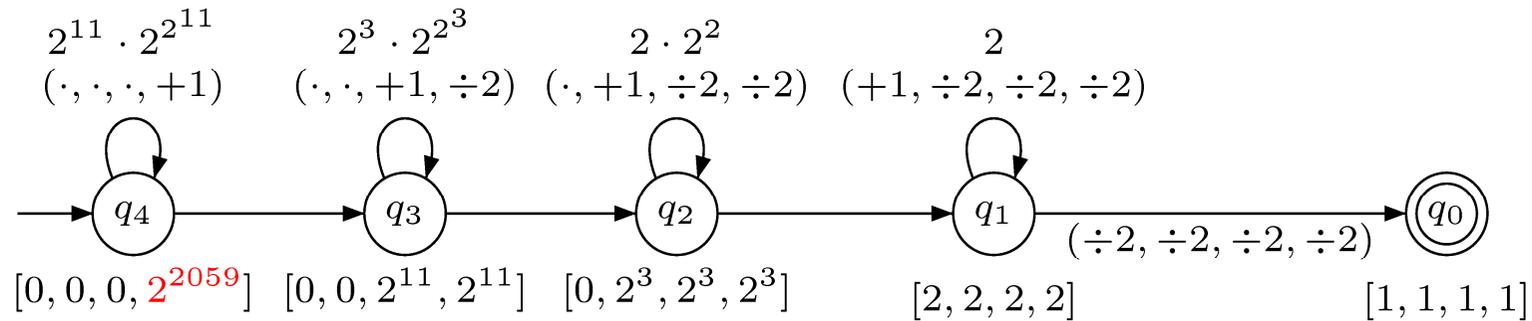


# Counter system with $\{+1, \div 2\}$

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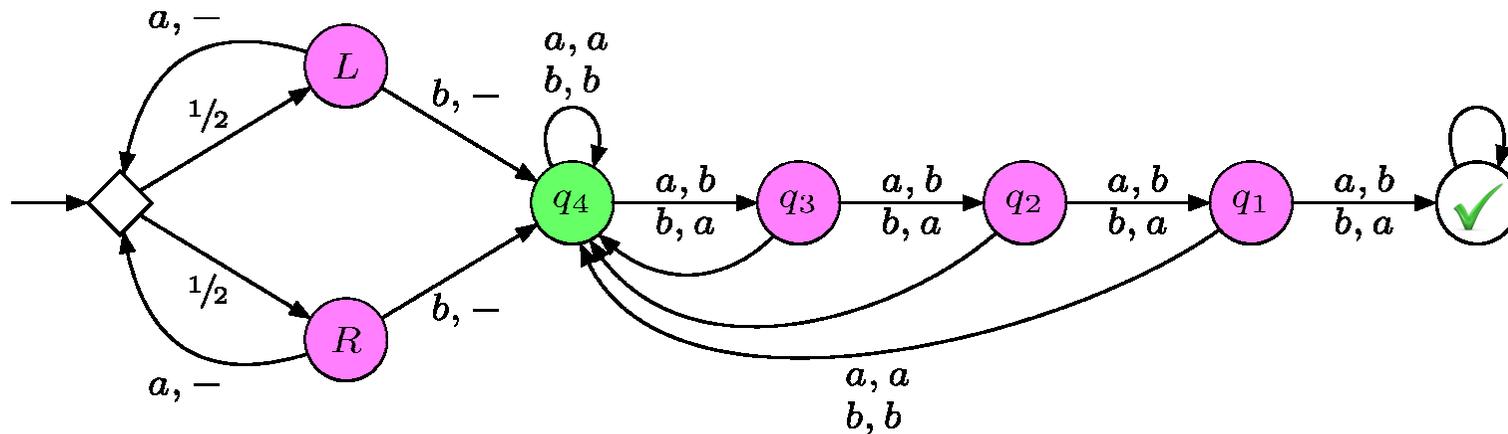


# Counter system with $\{+1, \div 2\}$



➔ non-elementary growth !

# Player 1 perfect, player 2 partial

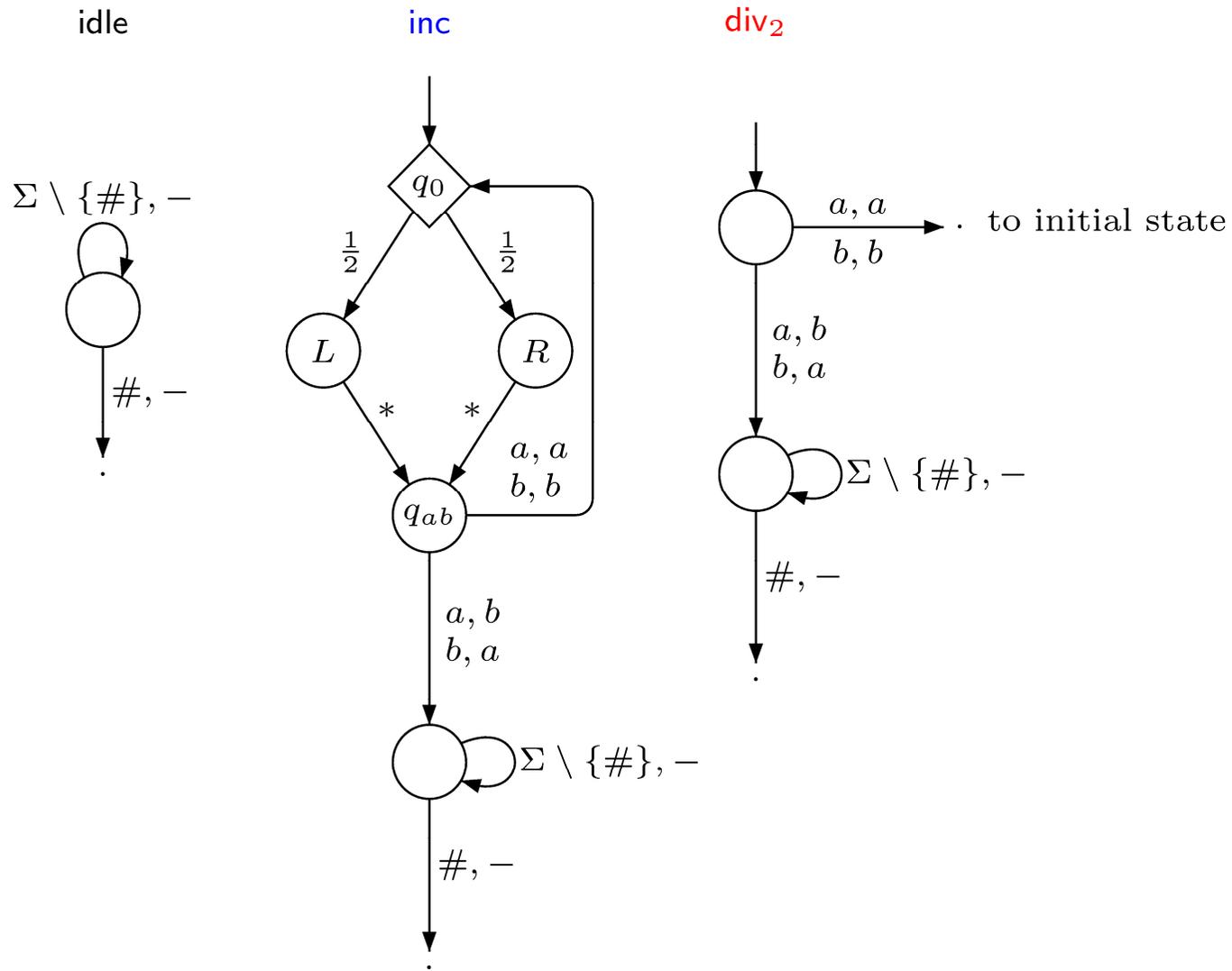


Show that:

1. games can simulate **increment** and **division by 2**
2. Such counter systems require non-elementary counter value for reachability

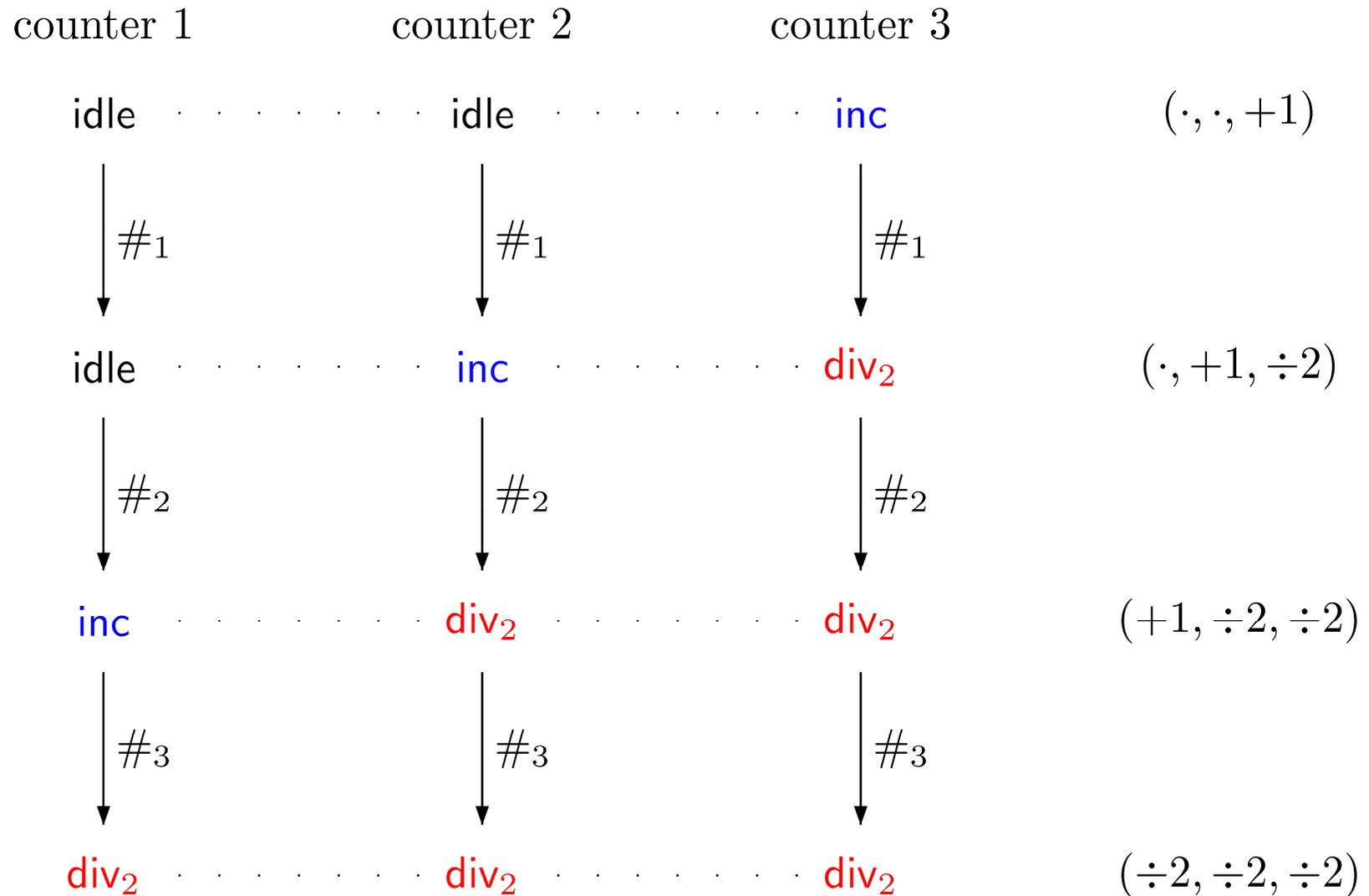
$$2^{\left. \begin{matrix} 2 \\ 2 \cdot 2 \end{matrix} \right\} \text{height } n}$$

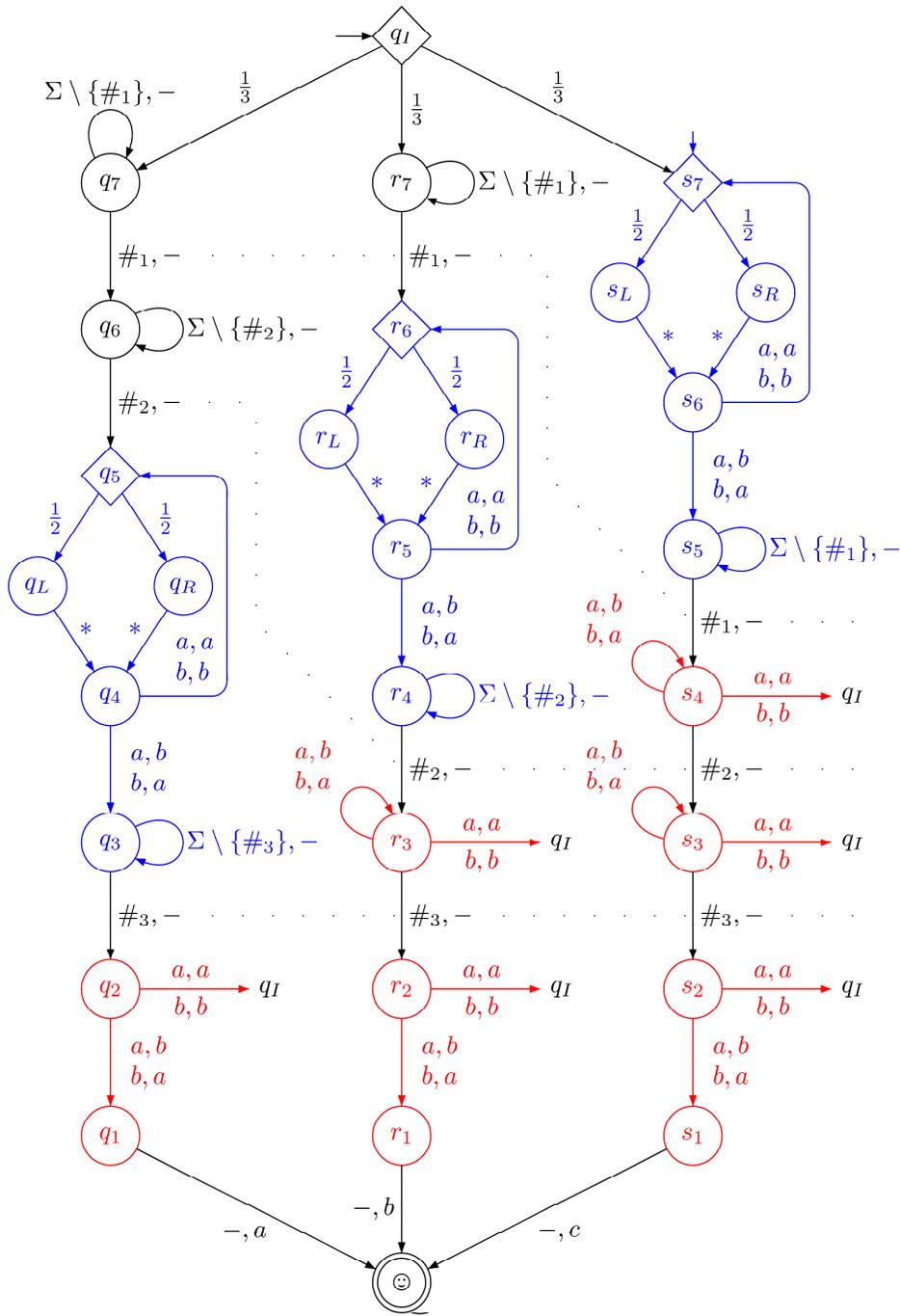
# Game gadgets for $\{\text{idle}, +1, \div 2\}$



# Game gadgets for $\{\text{idle}, +1, \div 2\}$

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Game that simulates 3 counters...

## Pure Strategies: Player 1 Perfect, Player 2 Partial

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PI1 Perfect, PI 2 Partial:  
Stochastic, Pure.  
Non-elementary lower bound

# Player 1 perfect, player 2 partial

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Memory of **non-elementary** size for pure strategies

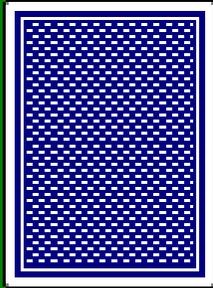
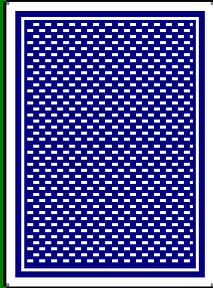
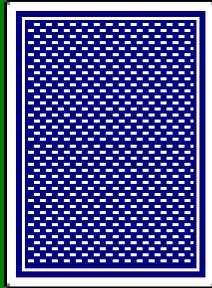
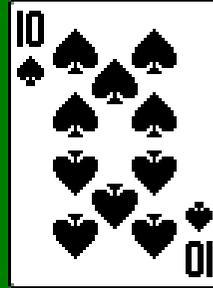
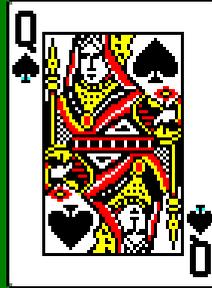
- lower bound: simulation of counter systems with increment and division by 2
- upper bound:
  - positive**: non-elementary counters simulate randomized strategies
  - almost-sure**: reduction to iterated positive

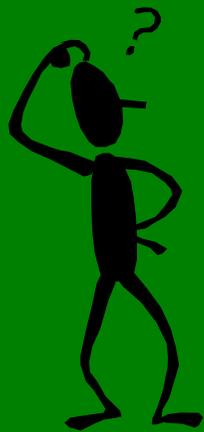
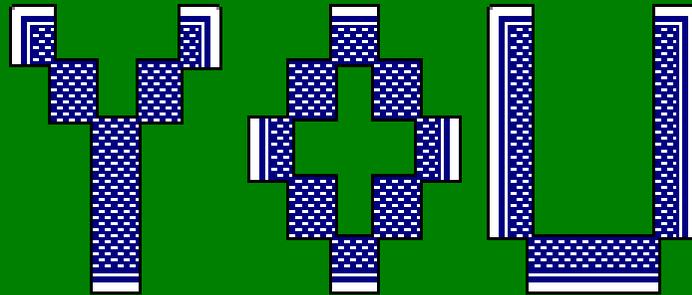
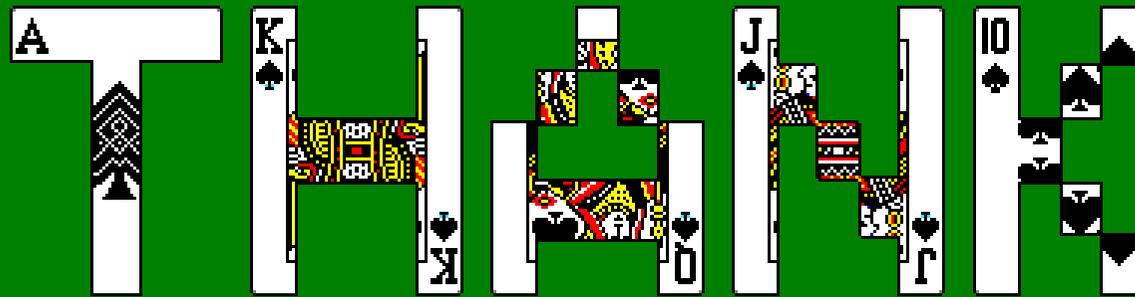
Counter systems with  $\{+1, \div 2\}$  require non-elementary counter value for reachability  $2 \left. \begin{matrix} 2 \\ 2 \cdot 2 \\ \vdots \\ 2 \cdot 2 \end{matrix} \right\} \text{height } n$

# New results

## Reachability - Memory requirement (for player 1)

<b>Almost-sure</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	exponential (belief) [CDHR'06]	memoryless [BGG'09]	exponential (belief) [BGG'09]
rand. act.-inv.	exponential (belief not sufficient)		finite (at least non- elementary)
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)
<b>Positive</b>	player 1 partial player 2 perfect	player 1 perfect player 2 partial	2-sided both partial
rand. act.-vis.	memoryless	memoryless	memoryless
rand. act.-inv.	memoryless		memoryless
pure	exponential (belief not sufficient)	non-elementary complete	finite (at least non- elementary)





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Thank you !



Questions ?