### Nash Equilibria in Timed Games

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This talk is based on joint works with Romain Brenguier and Nicolas Markey

#### Outline

#### 1. The context

- 2. Multiplayer timed games
- 3. Focusing on two-player timed games
- 4. A generic approach for reachability objectives
- 5. Conclusion

- Context: formal verification of systems
- Why timed systems?
  - to model time-constrained systems (eg embedded systems)
  - to model systems running in real-time (for instance GPS)







#### safe

- X 0
- y 0



	safe	$\xrightarrow{23}$	safe
х	0		23
y	0		23



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm
х	0		23		0
у	0		23		23



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm
х	0		23		0		15.6
у	0		23		23		38.6



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe
х	0		23		0		15.6		15.6
у	0		23		23		38.6		0



	safe	$\xrightarrow{23}$	safe	 alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23	0		15.6		15.6	
у	0		23	23		38.6		0	

#### failsafe

... 15.6

0



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23		38.6		0	

failsafe	$\xrightarrow{2.3}$	failsafe
 15.6		17.9
0		2.3



	safe	$\xrightarrow{23}$	safe	 alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23	0		15.6		15.6	
у	0		23	23		38.6		0	

	failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	repairing
•••	15.6		17.9		17.9
	0		2.3		0



	safe	$\xrightarrow{23}$	safe	 alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23	0		15.6		15.6	
у	0		23	23		38.6		0	

failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	repairing	$\xrightarrow{22.1}$	repairing
 15.6		17.9		17.9		40
0		2.3		0		22.1



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	 failsafe	
х	0		23		0		15.6	15.6	
у	0		23		23		38.6	0	

	failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	repairing	$\xrightarrow{22.1}$	repairing	$\xrightarrow{\text{done}}$	safe
•••	15.6		17.9		17.9		40		40
	0		2.3		0		22.1		22.1

• to model uncertainty



• to model uncertainty



• to model uncertainty



• to model an interaction with an environment



• to model uncertainty



• to model an interaction with an environment



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• to model an interaction with an environment









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- Aim (for the controller): avoid (2) and reach (2)
- How do we play? According to strategies



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![](_page_25_Figure_2.jpeg)

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A (memoryless) winning strategy

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- from  $(\ell_2,\star)$ , play  $(1-\star,c_2)$

![](_page_26_Figure_2.jpeg)

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- from  $(\ell_3, 1)$ , play  $(0, c_3)$

![](_page_27_Figure_2.jpeg)

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- from  $(\ell_2, \star)$ , play  $(1 \star, c_2)$
- from  $(\ell_3, 1)$ , play  $(0, c_3)$
- from ( $\ell_1$ , 1), play (1,  $c_4$ )

![](_page_28_Figure_2.jpeg)

#### Rule of the game

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- How do we play? According to strategies

```
f: history \mapsto (delay, cont. transition)
```

#### What we are computing here

• (simple) worst-case winning strategies

![](_page_29_Figure_2.jpeg)

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- How do we play? According to strategies
  - f : history  $\mapsto$  (delay, cont. transition)

#### What we are computing here

- (simple) worst-case winning strategies
- should win against any strategy of the opponent

#### Theorem [AMPS98,HK99,...]

For  $\omega$ -regular objectives, it is decidable whether the controller has a winning strategy. It is EXPTIME-complete for safety and reachability objectives.

 $\rightsquigarrow$  classical regions are sufficient to solve those games

(we can for instance compute the so-called attractor)

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![](_page_31_Figure_5.jpeg)

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![](_page_32_Figure_5.jpeg)

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![](_page_33_Figure_5.jpeg)

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![](_page_34_Figure_5.jpeg)

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![](_page_35_Figure_5.jpeg)
# A short visit to control (two-player) timed games

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### Multi-agent systems

#### • Why multi-agent systems?

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#### • Why multi-agent systems?

• development of distributed systems (distributed scheduling problems, power control problems, mobile systems, ...)

#### • How can we model those systems?

- with distributed automata
- with multiplayer games
- ...

As a natural extension of two-player timed games:



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#### How do we play those games?

- Each player plays according to standard strategies (which specify moves at each step)
- Once all moves are given, the shortest delay is chosen and a corresponding transition is non-deterministically selected

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#### How do we play those games?

- Each player plays according to standard strategies (which specify moves at each step)
- Once all moves are given, the shortest delay is chosen and a corresponding transition is non-deterministically selected

→ They are infinite-state non-deterministic concurrent games Strategies are assumed to be pure (*i.e.* not stochastic)

As a natural extension of two-player timed games:



### What is the aim of the game?

Each player has her own objective (via a preference relation or a payoff function).
 NP: qualitative objective = 0/1 payoff function

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#### What is the aim of the game?

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- The notions of winning strategies are no more relevant, as those games are not zero-sum

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#### What is the aim of the game?

Each player has her own objective (via a preference relation or a payoff function).
 NB: qualitative objective = 0/1 payoff function

• The notions of winning strategies are no more relevant, as those games are not zero-sum

• The players should play rationally, for instance according to equilibria (eg Nash equilibria, subgame-perfect equilibria, secure equilibria, ...)

## Nash equilibria

### Definition

# Nash equilibria (in deterministic games)

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# Nash equilibria (in non-deterministic games)

### Definition

A strategy profile  $(\sigma_j)_{A_j \in A_{gt}}$  is a Nash equilibrium if no player can improve her payoff by unilaterally changing her strategy.

What if there are several outcomes due to non-determinism?

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### Definition

A pair  $((\sigma_j)_{A_j \in Agt}, \pi)$  is a pseudo-Nash equilibrium if  $\pi$  is an outcome of  $(\sigma_j)_{A_j \in Agt}$  and no player can improve her payoff by unilaterally changing her strategy (*i.e.*, no outcome improves the payoff of  $\pi$ ).

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There are several (pseudo-)Nash equilibria:

- Some with payoff (1, 1, 0)
- Some with payoff (1, 1, 1)

[BBM10a]

### Two different approaches to solve the problem

#### • use the specificity of two-player timed games

- can be turned into two twin turn-based finite games
- apply to ω-regular objectives (and even more!)

[BBM10a] Bouyer, Brenguier, Markey. Computing equilibria in two-player timed games via turn-based finite games (FORMATS'10). [BBM10b] Bouyer, Brenguier, Markey. Nash equilibria for reachability objectives in multi-player timed games (CONCUR'10).

## Two different approaches to solve the problem

#### • use the specificity of two-player timed games

- can be turned into two twin turn-based finite games
- apply to ω-regular objectives (and even more!)
- consider a general abstract framework
  - non-deterministic concurrent multiplayer (infinite) games
  - restrict to qualitative reachability objectives
  - apply the general framework to finite games and then to timed games (through a simulation theorem), and get "optimal" algorithms

[BBM10b]

[BBM10a]

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region x = 0

**r**o

### From timed games to finite concurrent games...

Compute the Nash equilibria in the following timed game:



#### Proposition

(Pseudo-)Nash equilibria "coincide" in both games.





Game where Player 1 has an advantage (and all payoffs for Player 2 are set to 0)





Game where Player 2 has an advantage (and all payoffs for Player 1 are set to 0)





### Proposition

(Pseudo-)Nash equilibria in the game on the left correspond to twin Nash equilibria in the two games on the right.

## Building turn-based games

Games where Player 1 has an advantage.






Games where Player 2 has an advantage.











#### Proposition

The twin Nash equilibria in the two games on the left coincide with the twin Nash equilibria in the two turn-based games on the right.



#### Theorem

(Pseudo-)Nash equilibria in the original timed game coincide with the twin Nash equilibria in the two turn-based games.













19/30







19/30

































There is a single Nash equilibrium in the original timed game.

#### Theorem

Using this construction, we can compute (pseudo-)Nash equilibria:

- in two-player timed games
- with large classes of objectives

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- in two-player timed games
- with large classes of objectives

#### Examples of objectives

- ω-regular objectives
- optimal paths
- ...

#### Theorem

Using this construction, we can compute (pseudo-)Nash equilibria:

- in two-player timed games
- with large classes of objectives

#### An interesting side-result

In two-player control timed games, the controller (Player 1) has a winning strategy iff she has a winning strategy in the turn-based game where Player 2 has the advantage.

#### Theorem

Using this construction, we can compute (pseudo-)Nash equilibria:

- in two-player timed games
- with large classes of objectives

#### Example

This technique does not extend to three-player timed games:

$$0 < x < 1 \qquad (0, 0, 1)$$

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#### Context of these developments

- general (possibly infinite-state) concurrent non-deterministic multiplayer games
- qualitative reachability objectives

#### 



- the path visits all winning states for all other players
- the path doesn't visit the winning states of Player 1



• from any state along the path, Player 1 cannot enforce visiting his winning state



- from any state along the path, Player 1 cannot enforce visiting his winning state
  - $\bullet$  all states along the path are out of the attractor of Player 1



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Two counter-examples:





- from any state along the path, Player 1 cannot enforce visiting his winning state
  - $\bullet\,$  all states along the path are out of the attractor of Player 1

 $\sim$  this is ok for deterministic turn-based games  $\sim$  this is **not ok** for the general case!

• Two counter-examples:



#### And what if only Player 1 and Player 2 lose?

#### 

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- the path visits all winning states for all other players
- the path doesn't visit the winning states of Player 1 and of Player 2

And what if only Player 1 and Player 2 lose?



• from any state along the path, if Player 1 deviates, he should not be able to enforce visiting his winning states. Idem for Player 2.
And what if only Player 1 and Player 2 lose?



- from any state along the path, if Player 1 deviates, he should not be able to enforce visiting his winning states. Idem for Player 2.
  - $\rightsquigarrow\,$  requires that we are able to compute who is to be blamed for the deviation

And what if only Player 1 and Player 2 lose?



- from any state along the path, if Player 1 deviates, he should not be able to enforce visiting his winning states. Idem for Player 2.

  - $\sim$  if there is a unique suspect for the deviation, we should blame him (as in the previous case)

And what if only Player 1 and Player 2 lose?



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  - $\rightsquigarrow\,$  if both players are suspect for the deviation, we should be able to blame each of them.

## If we want to formalize...

#### Definition

If P is a set of players, the *repellor set* for P (written Rep(P)) is defined inductively by  $\text{Rep}(\emptyset) =$  "all states", and then as the largest set satisfying:

- $\forall A \in P$ ,  $\operatorname{Rep}(P) \cap \odot_A = \emptyset$
- $\forall s \in \operatorname{Rep}(P), \exists m \text{ s.t. } \forall s', s' \in \operatorname{Rep}(P \cap \operatorname{Susp}((s, s'), m))$

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#### Theorem

There is a pseudo-Nash equilibrium with payoff  $\nu_P$  (*i.e.* 0 for all players in P and 1 for all players out of P) iff there is an infinite path in  $S_{\text{Rep}}(P)$  which visits a winning state  $\odot_A$  for each  $A \notin P$ .

NB: this equivalence is furthermore constructive.

A generic procedure to compute (pseudo-)Nash equilibria in concurrent non-deterministic games

- Guess the payoff function  $\nu_P$  (if not already given);
- **2** Build the repellor transition system  $S_{\text{Rep}}(P)$ ;
- Find a path in  $S_{\text{Rep}}(P)$  visiting the objectives of Agt  $\setminus P$ .

## Side results: the case of finite games

	$\mathcal{C}^{nd}$ , $\mathcal{C}^{d}$ , $\mathcal{TB}^{nd}$		$\mathcal{TB}^{d}$	
	bounded	general	bounded	general
Existence	P-c.	NP-c.	True	True
Verification	P-c.	NP-c.	P-c.	NP-c.
Constr. Ex.	P-c.	NP-c.	P-c.	NP-c.

- $TB^{d}$ ,  $TB^{nd}$ : turn-based games (deterministic and non-deterministic, resp.)
- $C^{d}, C^{nd}$ : concurrent games (deterministic and non-deterministic, resp.)
- bounded: bounded number of players (hence not a parameter in the complexity)
- general: the number of players is a parameter of the problem.

# The case of timed games

#### How do we proceed?

- Construct an appropriate region game
- $\bullet$  Define a simulation that preserves all  $\textcircled{\sc {i}}$  's and suspect players, hence repellors
- Prove that the two games (original timed game and region game) simulate each other

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#### Theorem

The verification, existence and constrained-existence problems for pseudo-Nash equilibria in timed games are EXPTIME-complete.

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# Conclusion and ongoing/further work

### Summary of the results

• A specific technique for computing Nash equilibria for large classes of objectives in two-player timed games

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- A specific technique for computing Nash equilibria for large classes of objectives in two-player timed games
- A general technique for computing Nash equilibria for qualitative reachability objectives in multiplayer (potentially infinite) games:
  - can be applied to finite games
  - can be applied to timed games

In both cases, yields optimal complexity bounds.

# Conclusion and ongoing/further work

### Summary of the results

- A specific technique for computing Nash equilibria for large classes of objectives in two-player timed games
- A general technique for computing Nash equilibria for qualitative reachability objectives in multiplayer (potentially infinite) games:
  - can be applied to finite games
  - can be applied to timed games

In both cases, yields optimal complexity bounds.

#### What's going on now?

- Use the general technique to compute Nash equilibria in other families of systems (eg pushdown games)
- Extend the repellor idea beyond reachability
- Consider randomized strategies
- Compute other kinds of equilibria