

# Stackelberg-Pareto Synthesis

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# Outline

1. Reactive Synthesis
2. Stackelberg-Pareto Synthesis
3. Our Results

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# Reactive Synthesis

**Reactive systems:** systems which constantly interact with the environment

Problem of **Reactive Synthesis** (RS)

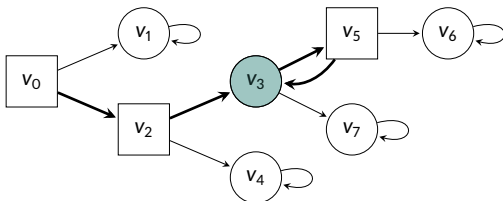
- given a **specification** for the system
- synthesize an adequate **controller** for the system
- enforce the specification **whatever the behavior** of the environment

**Classical approach** for RS [GTW02]

- interaction is modeled using a two-player game
- Player 0 = system, Player 1 = environment
- specification = objective

## Games: Arenas, Plays and Objectives

**Game Arena:** tuple  $G = (V, V_0, V_1, E, v_0)$  with  $(V, E)$  a directed graph



**Play:** infinite path starting with the **initial vertex**  $v_0$ ,  $\rho = v_0 v_2 (v_3 v_5)^\omega$

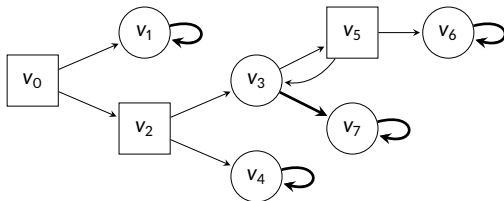
**Objective**  $\Omega_i$  for Player  $i \in \{0, 1\}$ :

- subset of plays,  $\rho$  **satisfies**  $\Omega_i$  if  $\rho \in \Omega_i$
- **reachability:** plays which visit  $T \subseteq V$

## Games: Strategies and Consistency

**Strategy**  $\sigma_i: V^* \times V_i \rightarrow V$  dictates the choices of Player  $i$

→ given  $\underbrace{v_0 v_1 \dots}_{h} \dots \underbrace{v_k}_{\in V_i}$  yields  $v_{k+1}$  from  $h v_k$  (memory) or  $v_k$  (without)



A play is **consistent** with  $\sigma_i$  if  $v_{k+1} = \sigma_i(v_0 \dots v_k) \forall k \in \mathbb{N}, \forall v_k \in V_i$

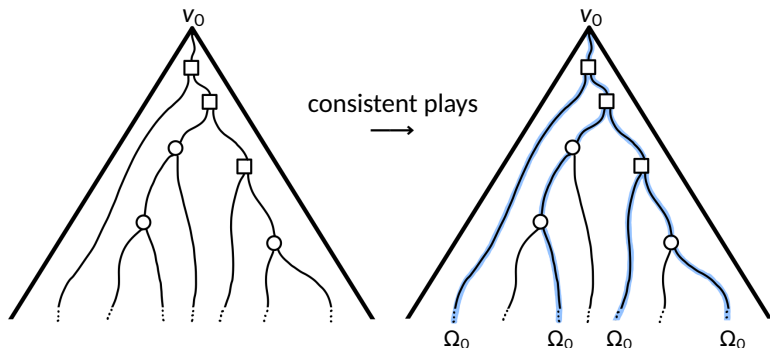
Consider the **set of plays consistent** with a strategy  $\sigma_0$

→  $\text{Plays}_{\sigma_0} = \{v_0 v_1^\omega, v_0 v_2 v_4^\omega, v_0 v_2 v_3 v_7^\omega\}$

## Back to Reactive Synthesis

Classical approach for RS: **zero-sum** games [GTW02]

- objective of environment is **opposite** objective of system:  $\Omega_1 = \neg\Omega_0$
- if  $\Omega_0 = \text{Reach}(T)$ , then  $\Omega_1 = \text{Avoid}(T)$
- **adversarial environment**: we want a winning strategy for the system



## Setbacks and Alternative

Fully adversarial environment: **bold abstraction of reality**

- assumes the **only goal** of the environment is to **make the system fail**
- environment can be composed of **one or several** components
- each with **own objective**

Alternative: framework of **Stackelberg games [vS37]** (non-zero-sum)

- Player 0 **announces** his strategy  $\sigma_0$
- Player 1 **rationally answers** with **optimal response** w.r.t. his objective
- goal of Player 0:
  - announce a strategy that **satisfies his objective**
  - **whatever the rational response** of Player 1



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## Our New Model

**Stackelberg-Pareto game** (SP game):  $\mathcal{G} = (G, \Omega_0, \Omega_1, \dots, \Omega_t)$

- Player 0 (system): objective  $\Omega_0$ , announces strategy  $\sigma_0$
- Player 1 (environment): **several objectives**  $\Omega_1, \dots, \Omega_t$  (components)

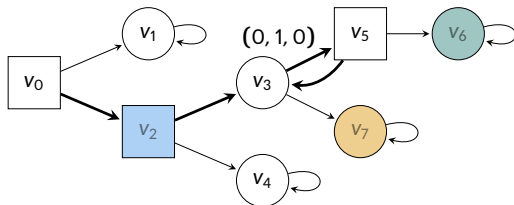
**Payoff** of  $\rho$  for Player 1 is the **vector of Booleans**  $\text{pay}(\rho) \in \{0, 1\}^t$

- **order**  $\leq$  on payoffs, e.g.,  $(0, 1, 0) < (0, 1, 1)$

$$\Omega_1 = \text{Reach}(\{v_6\})$$

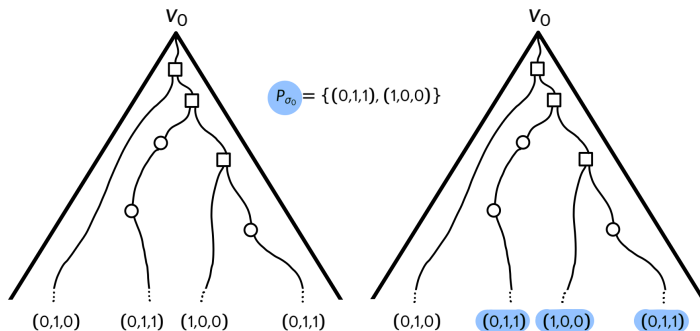
$$\Omega_2 = \text{Reach}(\{v_2\})$$

$$\Omega_3 = \text{Reach}(\{v_7\})$$



# Pareto-Optimal Payoffs

1. Player 0 announces his strategy  $\sigma_0$
2. Player 1 considers  $\text{Plays}_{\sigma_0}$ 
  - corresponding **set of payoffs**  $\{\text{pay}(\rho) \mid \rho \in \text{Plays}_{\sigma_0}\}$
  - identify **Pareto-optimal** (PO) payoffs (maximal w.r.t.  $\leq$ ) : set  $P_{\sigma_0}$

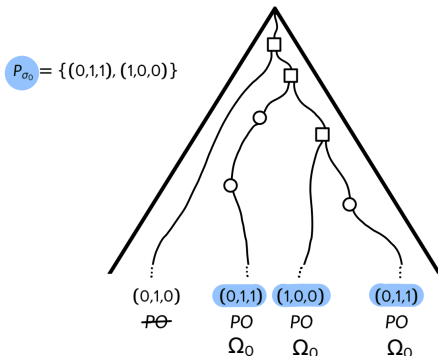


# Stackelberg-Pareto Synthesis Problem

## Stackelberg-Pareto Synthesis Problem (SPS problem)

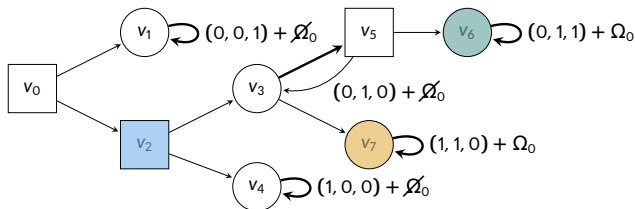
The SPS problem is to decide whether there exists a strategy  $\sigma_0$  for Player 0 such that for every play  $\rho \in \text{Plays}_{\sigma_0}$  with  $\text{pay}(\rho) \in P_{\sigma_0}$ , it holds that  $\rho \in \Omega_0$

Environment is **rational** and responds to  $\sigma_0$  **to get a Pareto-optimal payoff**  
 → Player 0 must **satisfy**  $\Omega_0$  in every such **rational response**



## SPS Problem Example (1/2)

Consider  $\sigma_0$  such that  $\sigma_0(v_3) = v_5$

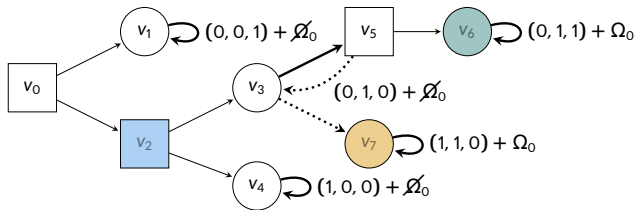


- $\text{Plays}_{\sigma_0} = \{ v_0 v_1^\omega, v_0 v_2 v_4^\omega, v_0 v_2 (v_3 v_5)^+ v_6^\omega, v_0 v_2 (v_3 v_5)^\omega \}$
- $\text{payoffs} = \{ (0, 0, 1), (1, 0, 0), (0, 1, 1), (0, 1, 0) \}$
- $P_{\sigma_0} = \{ (1, 0, 0), (0, 1, 1) \}$

Strategy  $\sigma_0$  is **not a solution** to the SPS problem, e.g.,  $\rho = v_0 v_2 (v_4)^\omega \notin \Omega_0$   
 $\rightarrow$  the only other **memoryless** strategy is **not a solution either**

## SPS Problem Example (2/2)

Finite-memory strategy  $\sigma'_0$  s.t.  $\sigma'_0(v_0v_2v_3) = v_5$  and  $\sigma'_0(v_0v_2v_3v_5v_3) = v_7$



$\sigma'_0$  is a solution to the SPS problem:  $\rho \in \Omega_0$  when  $\text{pay}(\rho) \in P_{\sigma'_0}$   
 $\rightarrow$  Player 0 **may need memory** to have a solution to the SPS problem

We consider SP games where **every objective** is

- parity (**parity SP games**): models general class of  $\omega$ -regular objectives
- reachability (**reachability SP games**): simpler setting

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# Our Results on SP games

## NEXPTIME-Completeness of the SPS problem

The SPS problem is NEXPTIME-complete for reachability SP games and for parity SP games

## Fixed-Parameter Complexity of the SPS problem

Solving the SPS problem is FPT for reachability SP games for parameter  $t$  (number of objectives of Player 1) and FPT for parity SP games for parameters  $t$  and the maximal priority according to each parity objective of Player 1

**Sound:** in practice, we can assume those parameters to have **small values**

NEXPTIME algorithm **not FPT** & FPT algorithm **not usable** for membership



# Complexity Class

## NEXPTIME-Membership

The SPS problem is in NEXPTIME for reachability and for parity SP games

Use **important result on the strategies** which are solution to the problem

- if Player 0 has a solution, he has a **finite-memory one**
- with at most an **exponential number** of memory states

Membership: **NEXPTIME algorithm** where

- non-deterministically **guess** a strategy (with exponential size)
- **check** that it is a solution **in exponential time** (using automaton)

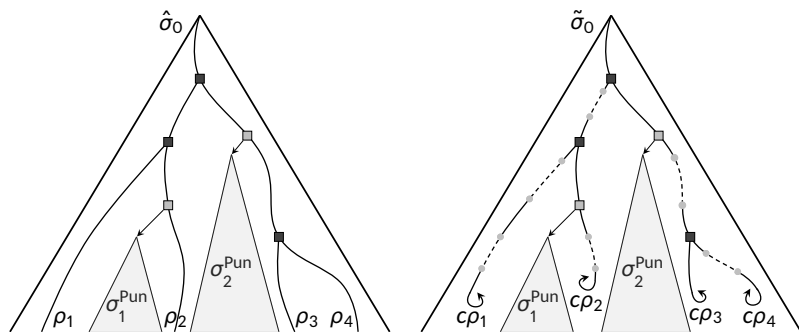
# Constructing a Finite-Memory Strategy

**Start from a solution**  $\sigma_0$  to the SPS problem and **one play**  $\rho_i$  per **PO payoff**

**Create**  $\hat{\sigma}_0$  which **follows**  $\sigma_0$  in prefix of  $\rho_i$

→ on deviation, switch to **punishing strategy**  $\sigma^{\text{Pun}}$  that imposes  $\Omega_0$  or  $\emptyset$

**Decompose**  $\rho_i$  into at most **exponentially many** parts and **compact** them



# The SPS problem is NP-hard on Tree Arenas

Simple setting of **tree arenas**: trees with loops on leaves

NP-hardness is shown using the **Set Cover problem** (NP-complete) [Kar72]

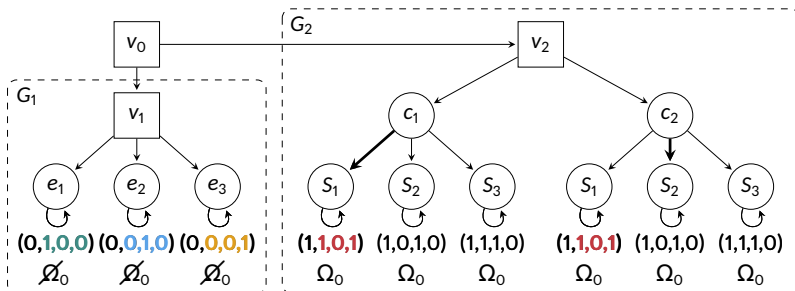
- $C = \{e_1, e_2, \dots, e_n\}$  of  $n$  elements
- $m$  subsets  $S_1, S_2, \dots, S_m$  s.t.  $S_i \subseteq C$
- an integer  $k \leq m$
- find  $k$  indexes  $i_1, i_2, \dots, i_k$  s.t.  $C = \bigcup_{j=1}^k S_{i_j}$ .

Devise a **SP game** such that:

Player 0 has a **solution** to the **SPS problem**  $\Leftrightarrow$  **solution** to the **SC problem**

## Reduction to the Set Cover Problem

$$C = \{e_1, e_2, e_3\}, S_1 = \{e_1, e_3\}, S_2 = \{e_2\}, S_3 = \{e_1, e_2\}, k = 2$$



Every play in  $G_1$  is **consistent with any strategy** of Player 0 and  $\notin \Omega_0$   
 $\rightarrow$  in a solution, payoffs from  $G_1$  **cannot be Pareto-Optimal**

Each payoff in  $G_1$  must be **< than some payoff in  $G_2$**  (corresponding to a set)

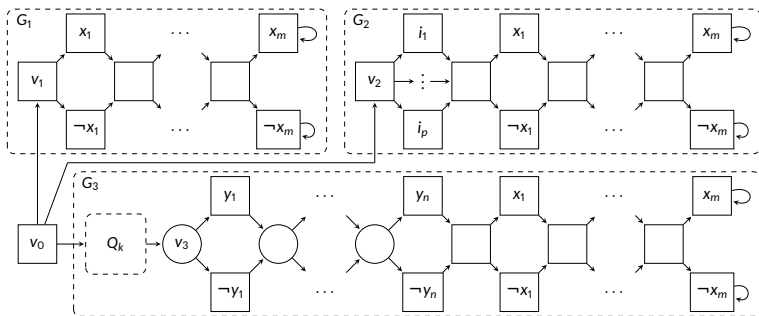
# Hardness

## NEXPTIME-Hardness

The SPS problem is NEXPTIME-hard for reachability and parity SP games

Intuition: use **succinct variant** of Set Cover problem (NEXPTIME-complete)

→ Set Cover problem succinctly defined using **CNF formulas**



# Challenger-Prover Game

To show FPT results: reduction to **Challenger-Prover game** (C-P game)

- **two-player zero-sum game**  $\mathcal{G}'$ , created from  $\mathcal{G}$
- played between **Challenger** ( $\mathcal{C}$ ) and **Prover** ( $\mathcal{P}$ )
- **solution** to the SPS problem in  $\mathcal{G} \iff$  **winning strategy** for  $\mathcal{P}$  in  $\mathcal{G}'$
- described in a **generic way**, later **adapted** to parity/reachability

Intuition:  $\mathcal{P}$  tries to **show** the existence of a solution,  $\mathcal{C}$  tries to **disprove** it

# Bibliography I

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