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A generic framework for anytime execution-driven planning in robotics

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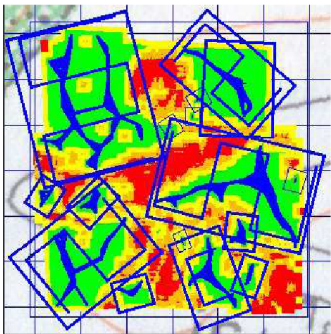
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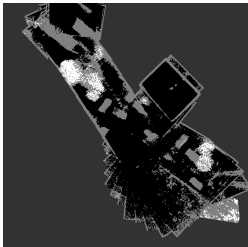
Illustrative example: autonomous emergency landing

- ▶ unknown environment
- ▶ map a rectangular zone and quickly find a place to land
- ▶ candidate landing zones after automated mapping



- ▶ *candidate zones not necessary landable!*
- ▶ need for a long-term planning of candidate landing zones to explore in order to minimize the mission's duration
- ▶ **Which contingent strategy to apply depending on hazards?**

Illustrative example: autonomous emergency landing



▶ Huge state space due to many state variables:

- ▶ (on-ground)
- ▶ (explored ?z - zone)
- ▶ (landable ?z - zone)
- ▶ (at ?z - (either base zone))
- ▶ (com)
- ▶ (fuel-level)
- ▶ (available-memory)

▶ Modeled as a Markov Decision Process *necessary solved on-line* after image processing

▶ Worst-case optimization time with an embedded computer running at 2 Ghz (assuming on-board memory is sufficient): 55 minutes with 5 zones (540 years with 10 zones) but mission's typical duration is about 15 minutes!

reactivity

▶ Need for a (different) deterministic planner for generating exploration paths in candidate landing zones

genericity

▶ Need to formally validate the safety of the entire mission

validation

Automated planning: definition

Automated planning: **definition**

Automated planning is a branch of artificial intelligence concerning the automatic generation of strategies or action sequences that achieve a given objective knowing an initial state and actions effects.

Automated planning: **features**

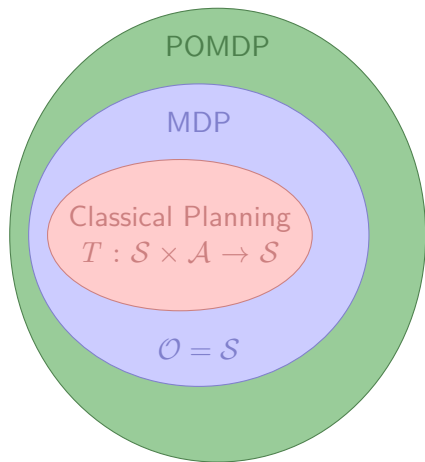
- ▶ long-term and deliberative reasoning
- ▶ combinatorial explosion
- ▶ consumes memory and CPU time

Automated planning: **challenges for robotics**

- ▶ interaction with other functionalities (perception and action)
- ▶ real-time decisions
- ▶ validation of decisions w.r.t. the entire architecture

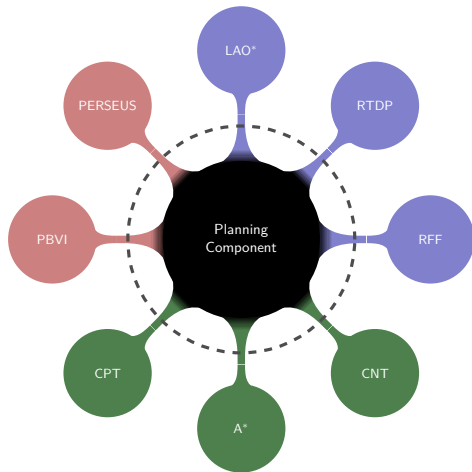
Automated planning: a generic formalism

- ▶ \mathcal{S} : set of states
- ▶ \mathcal{S}_I : set of initial states
- ▶ \mathcal{S}_G : set of goal states
- ▶ \mathcal{A} : set of actions
- ▶ \mathcal{O} : set of observations
- ▶ $T : \mathcal{S} \times \mathcal{A} \rightarrow 2^{\mathcal{S}}$: transition function
- ▶ $R : \mathcal{S} \times \mathcal{A} \times \mathcal{S} \rightarrow \mathbb{R}$: reward function
- ▶ $O : \mathcal{S} \times \mathcal{A} \rightarrow 2^{\mathcal{O}}$: observation function



Purpose: design a generic planning function based on the above concepts

A single planning component, with a variable planner



- ▶ Same **interface** for all planners
- ▶ Same **behavior** for all planners
- ▶ Behavior's **code independent** from the planner used (**classical**, **MDP**, **POMDP**)
- ▶ Reasoning data structures owned by planners
- ▶ Facilitates **reusability** and **validation**

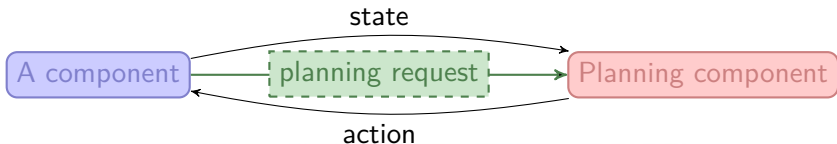
Basic concepts: planning request & action request

Planning request (plan construction)

- ▶ set of **initial states** from which the planner must compute an optimized action (knowing long-term requirements) ;
- ▶ **time allocated** to the plan construction ;
- ▶ **algorithm** used to construct the plan ;
- ▶ algorithm **parameters**.

Action request (plan execution)

An optimized action to apply in a given state.



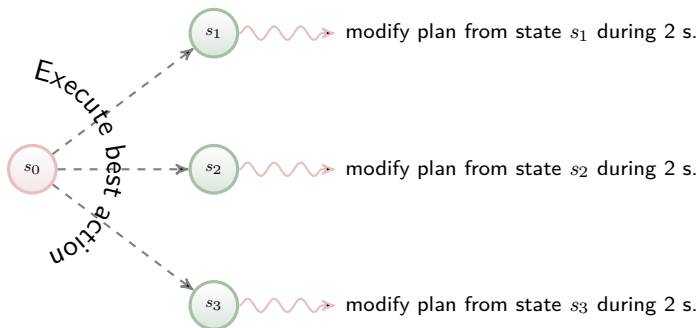
Anytime property, planning & action request interleaving



plan from
state s_0
during 10 s.

Initial planning phase from the initial state (bootstrap)

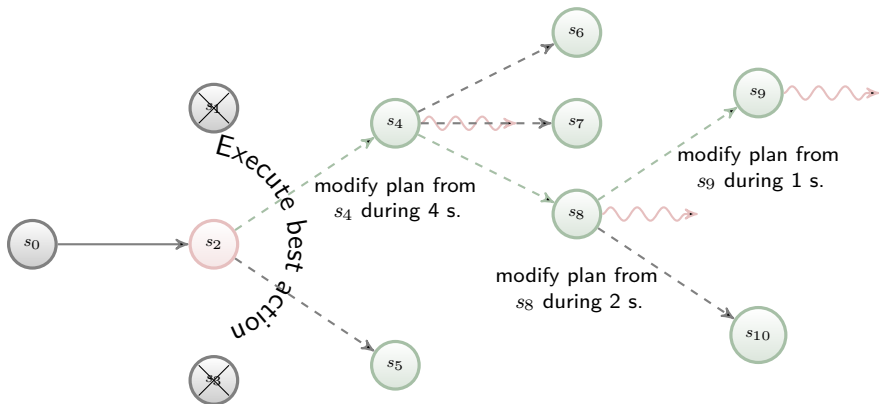
Anytime property, planning & action request interleaving



// Execution of the best action planned in s_0 , approximate execution time is 6 s.

// Planning from possible next states during 2 s. each.

Anytime property, planning & action request interleaving

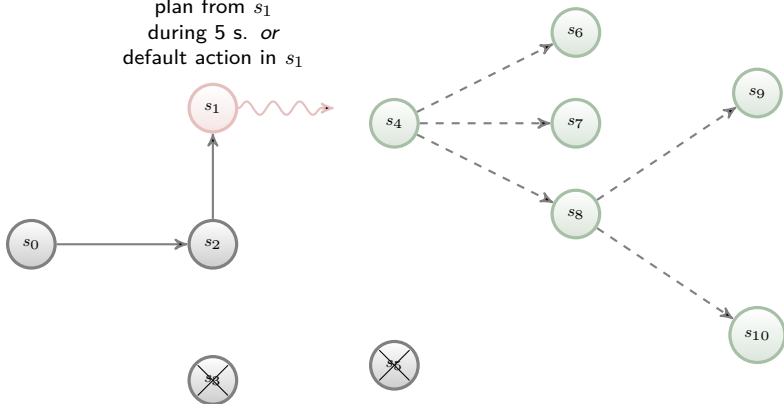


// Execution of the best action planned in current state s_2 , approximate execution time is 7 s.

// Planning from states of the most probable execution path.

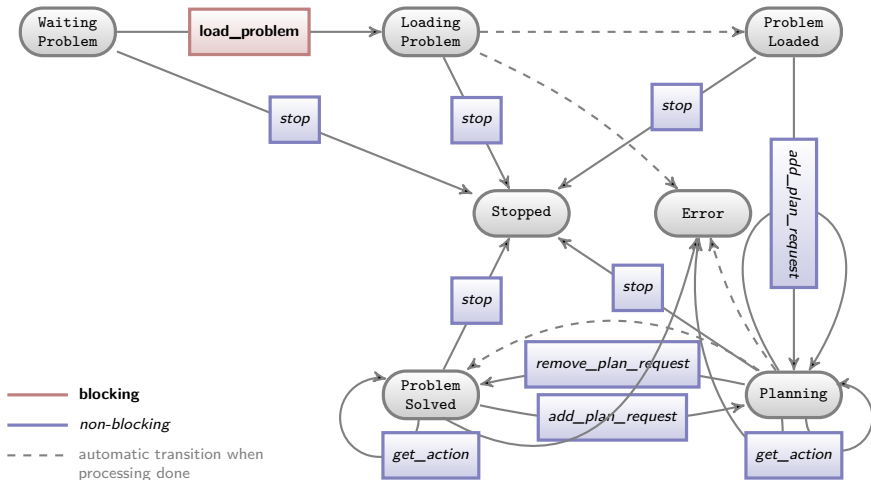
Anytime property, planning & action request interleaving

plan from s_1
during 5 s. or
default action in s_1

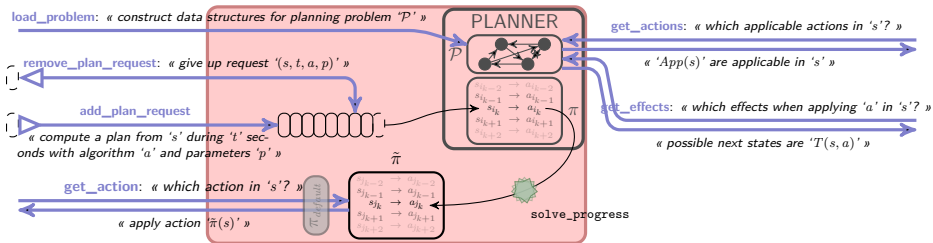


- Model shift: state s_1 was actually reachable from s_2 !
- Plan from current state s_1 during 5 s. (or default action)
- Keep s_4 and its potential successors as very likely reachable

On-line planning component: state machine



On-line planning component: requests management



- ▶ No need to assume the planner's code is thread-safe
- ▶ Only the locally-copied policy $\tilde{\pi}$ is protected by mutex
- ▶ Default policy filtering action requests (validation & reactivity)

Variable planner as a template of the planning component

Each planner is a class that must define the following embedded types and methods.

```
class Planner {
```

```
// Embedded types
```

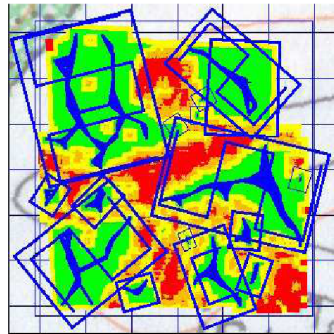
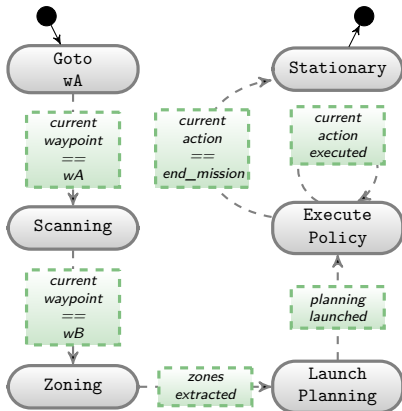
```
class problem_type {...};  
class state_type {...};  
class state_set_type {...};  
class action_type {...};  
class action_set_type {...};  
class policy_type {...};  
typedef enum {...} algorithm_enum;  
class algorithm_parameters_type {...};  
class algorithm_statistics_type {...};
```

```
// Member functions
```

```
void problem(const problem_type&);  
void load_problem_begin();  
void load_problem_progress();  
bool problem_loaded() const;  
void load_problem_end();  
void algorithm(algorithm_enum,  
               const algorithm_parameters_type&);
```

```
void solve_begin(const state_set_type&);  
void solve_progress();  
void solve_end();  
bool converged() const;  
bool plan_defined(const state_type&) const;  
action_type get_action(const state_type&) const;  
action_type default_action(const state_type&) const;  
algorithm_statistics_type get_statistics() const;  
void update_policy(policy_type&,  
                  const state_set_type&) const;  
static bool plan_defined(const policy_type&,  
                        const state_type&);  
static action_type get_action(const policy_type&,  
                             const state_type&);  
action_set_type get_actions(const state_type&) const;  
state_set_type get_effects(const state_type&,  
                          const action_type&) const;  
};
```

Search & rescue mission



Zones extracted after
Scanning + Zoning

Planning components used: `PlanningComponent<HMDPPPlanner>`
`PlanningComponent<AstarPlanner>`

Conclusion and perspectives

- ▶ Design of a **generic and reactive planning component** for a modular robotics architecture
- ▶ Provide *immediate* services on demand to other modules
- ▶ Separation between requests' management (component) and planning algorithms (planner)
 - ⇒ **same requests' management for all planners**
 - ⇒ **planners are (template) plugins of the component**
- ▶ Implementation on the Orocos platform
- ▶ Experiments on a high dimensional search & rescue mission, and random challenging benchmarks
- ▶ Close future: Validate the planning components' behavior
 - ▷ Validate the component (requests' management) once and for all, assuming satisfied properties on the planner side
 - ▷ Validate all planners plugged to the planning component
 - ▷ Validate the default policy for each mission

Questions?

Thank you for your attention :-)

