

# Extended Capabilities of High-Level Planners

Lasse Einig

einig@informatik.uni-hamburg.de

University of Hamburg, Group TAMS

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# Outline

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# What is planning?

## Target

Achieve a desired goal state

- Low-level
  - Motion
  - Path
- High-level

# High-level Planner

- Classical
  - Forward chaining
  - Backward chaining
- Temporal
- Probabilistic
  - Markov decision process

Robotic High-level planning

Hierarchical Task Network (HTN)

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## HTN planner

- SHOP, SHOP2, NONLIN, SIPE-2, O-PLAN, UMCP
- Recursive task decomposition
  - Task size
- Domain specification
  - Operators
  - Methods
  - Axioms
- Problem

## HTN Operators

```
1 (:operator (!name ?arg1 ?arg2)  
2   (on ?table ?arg1)  
3   (on ?table ?arg1)  
4   ((on ?arg2 ?arg1) (:protection (on ?arg2 ?arg1))))  
5 )
```

A sample operator in a SHOP planning domain



## HTN Methods

```
1 (:method (name ?arg1)
2   plane
3   (enough-cash ?cash)
4   ((!buy-ticket ?plane ?x) (!travel ?arg1))
5   train
6   (not-enough-cash ?cash)
7   ((!buy-ticket ?train ?x) (!travel ?arg1))
8 )
```

A sample method in a SHOP planning domain

## HTN Axioms

```

1  (:- (travel-by-plane ?x)
2    (( ticket-price ?x ?t) (cash-available ?c) (call >= ?c ?t)
3      (distance ?x ?d) (call >= ?d 50)
4      (airport-available ))
5  )
  
```

A sample axiom in a SHOP planning domain

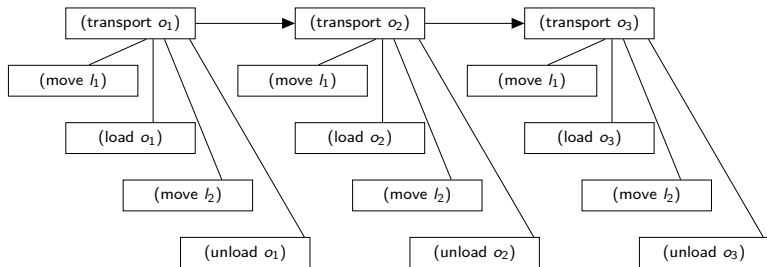
# Decomposition

- Structured
- Hierarchical

# Decomposition

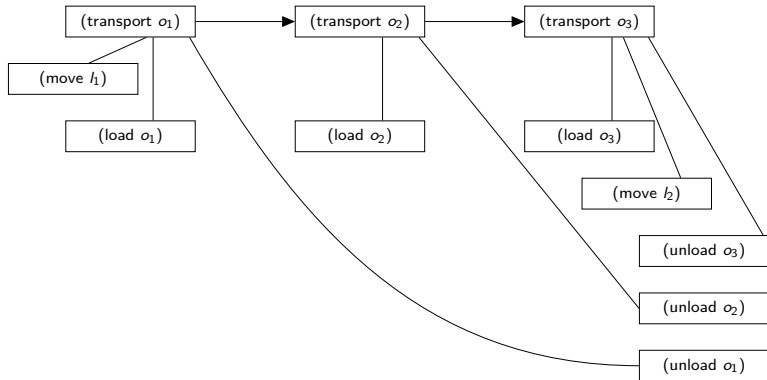
- Structured
- Hierarchical
- SHOP2
  - Partial Order

## Partial Ordering



A sample plan for moving three objects generated by SHOP algorithm using total ordering

## Partial Ordering



A sample plan using partial ordering

# SMACH

- State Machine
  - Native ROS library
  - ROS-independent

# SMACH

- State Machine
  - Native ROS library
  - ROS-independent
- States
  - Corresponds to an executable task



# SMACH

- **State Machine**
  - Native ROS library
  - ROS-independent
- States
  - Corresponds to an executable task
- Containers
- Nesting possible

# Containers

- State Machine
- Concurrency
- Sequence
- Iterator

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# Problem

- Sequential plans
- Resources lie wasted
  - Head
  - Torso
  - Base
  - Right arm
  - Left arm
- Time-inefficient



## Operators

- !tuck\_arms ?arms
- !move\_arm\_to\_side ?arm
- !move\_torso ?position
- !move\_base ?to
- !move\_base\_blind ?to
- !pick\_up\_object ?object ?arm
- !place\_object ?object ?arm ?to

## Problem Description

Room contains:

- Robot
- Counter
  - Coffee cup
- Table

## Problem Description

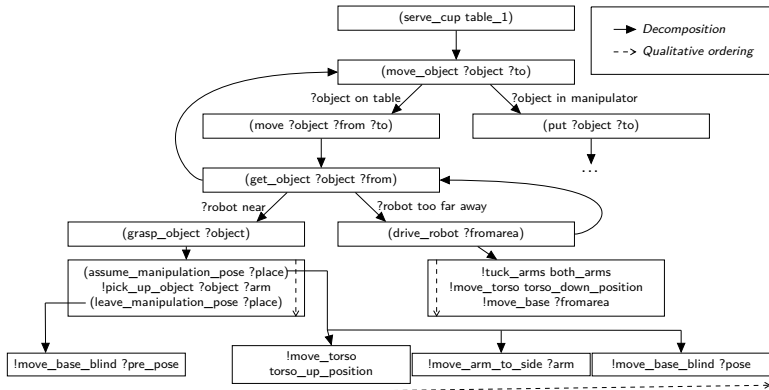
Room contains:

- Robot
- Counter
  - Coffee cup
- Table

### Objective

Serve coffee cup

# Methods and Decomposition



Domain decomposition for the “Serving Beverages” scenario



## Sequential Plan

### Analysis

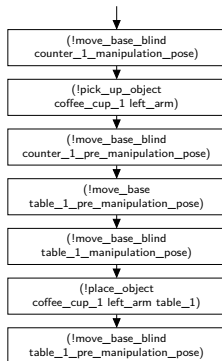
- 1** *!tuck\_arms both\_arms*
- 2** *!move\_torso torso\_down\_position*
- 3** *!move\_base counter\_1\_pre\_manipulation\_pose*
- 4** *!move\_torso torso\_up\_position*
- 5** *!move\_arm\_to\_side left\_arm*
- 6** *!move\_base\_blind counter\_1\_manipulation\_pose*
- 7** *!pick\_up\_object coffee\_cup\_1 left\_arm*
- 8** *!move\_base\_blind counter\_1\_pre\_manipulation\_pose*
- 9** *!move\_base table\_1\_pre\_manipulation\_pose*
- 10** *!move\_base\_blind table\_1\_manipulation\_pose*
- 11** *!place\_object coffee\_cup\_1 left\_arm table\_1*
- 12** *!move\_base\_blind table\_1\_pre\_manipulation\_pose*

## Sequential Plan

### Analysis

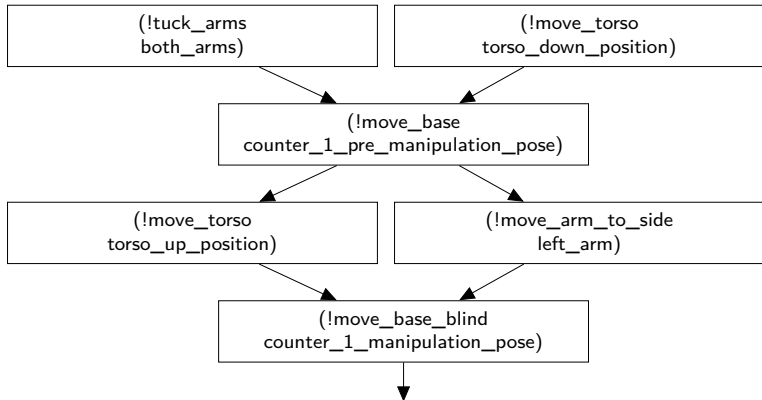
- |           |   |                |
|-----------|---|----------------|
| <b>1</b>  | <i>!tuck_arms both_arms</i>                             | [RA, LA]       |
| <b>2</b>  | <i>!move_torso torso_down_position</i>                  | [T]            |
| <b>3</b>  | <i>!move_base counter_1_pre_manipulation_pose</i>       | [B, RA, LA, T] |
| <b>4</b>  | <i>!move_torso torso_up_position</i>                    | [T]            |
| <b>5</b>  | <i>!move_arm_to_side left_arm</i>                       | [LA]           |
| <b>6</b>  | <i>!move_base_blind counter_1_manipulation_pose</i>     | [ALL]          |
| <b>7</b>  | <i>!pick_up_object coffee_cup_1 left_arm</i>            | [LA, H]        |
| <b>8</b>  | <i>!move_base_blind counter_1_pre_manipulation_pose</i> | [ALL]          |
| <b>9</b>  | <i>!move_base table_1_pre_manipulation_pose</i>         | [B, RA, LA, T] |
| <b>10</b> | <i>!move_base_blind table_1_manipulation_pose</i>       | [ALL]          |
| <b>11</b> | <i>!place_object coffee_cup_1 left_arm table_1</i>      | [LA, H]        |
| <b>12</b> | <i>!move_base_blind table_1_pre_manipulation_pose</i>   | [ALL]          |

## Parallel Plan – End



Sequential section of the *Serving Beverages* scenario

## Parallel Plan – Defensive

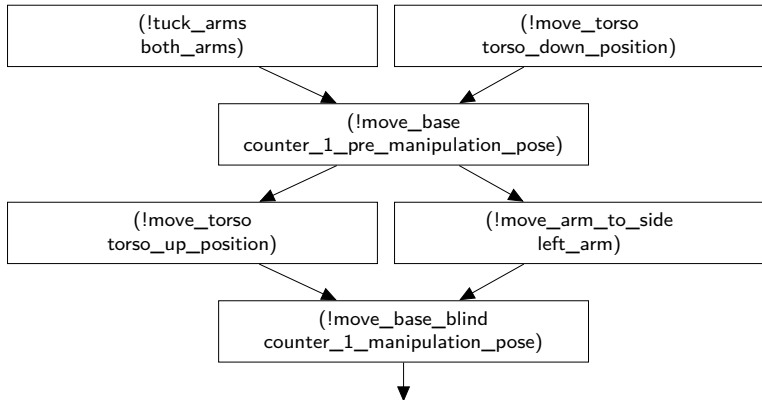


Parallel section of the *Serving Beverages* scenario with security constraint

## Implementation

- Linking actions by resources
- Find start actions
- Remove start actions from graph
- Assign actions to *PList* or *SList*
- Loop until graph is empty

## Parallel Plan – Defensive



Parallel section of the *Serving Beverages* scenario with security constraint

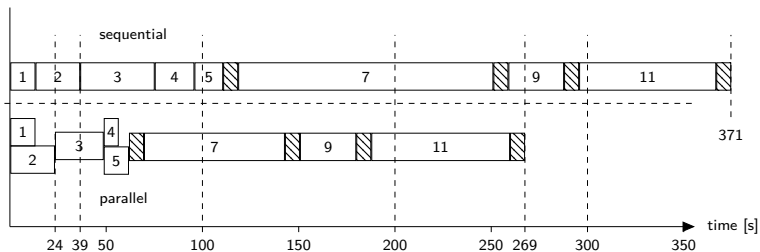
# Soundness

```

1 (
2   [
3     -!tuck_arms both_arms-
4     -!move_torso torso_down_position-
5   ]
6 -!move_base counter_1_pre_manipulation_pose-
7 (
8   [
9     -!move_torso torso_up_position-
10    -!move_arm_to_side left_arm-
11  ]
12 -!move_base_blind counter_1_manipulation_pose-
13 -!pick_up_object coffee_cup_1 left_arm-
14 -!move_base_blind counter_1_pre_manipulation_pose-
15 -!move_base table_1_pre_manipulation_pose-
16 -!move_base_blind table_1_manipulation_pose-
17 -!place_object coffee_cup_1 left_arm table_1-
18 -!move_base_blind table_1_pre_manipulation_pose-
19 )
20 )
  
```

Plan resulting from the parallelization algorithm optimizing the Serving Beverages scenario using security constraints

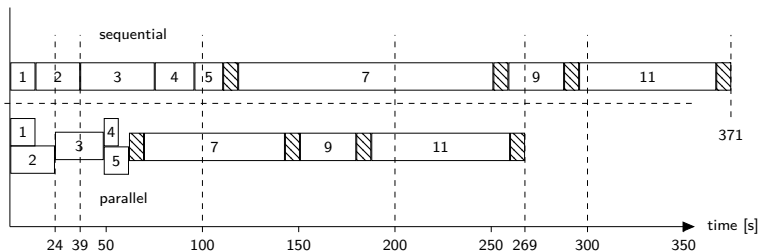
## Practical Experiment - Time



Result from the practical experiment of the Serving Beverages scenario



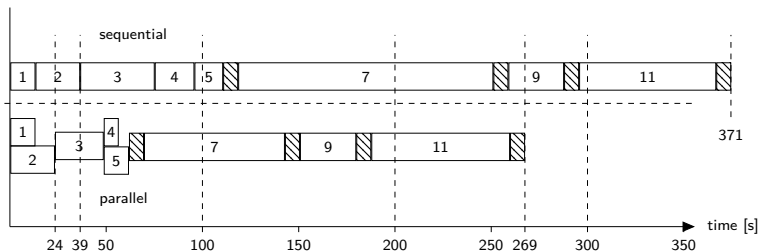
## Practical Experiment - Time



Result from the practical experiment of the Serving Beverages scenario

- 102 seconds  $\cong$  27.5%

## Practical Experiment - Time



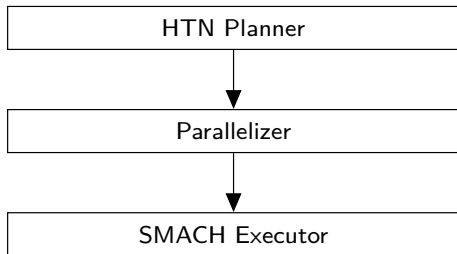
Result from the practical experiment of the Serving Beverages scenario

- 102 seconds  $\hat{=}$  27.5 %
- 15 seconds  $\hat{=}$  39.5 %

# Outline

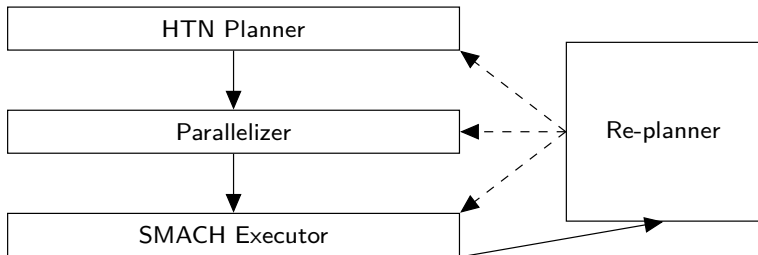
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## Closed-loop Re-planner



3-Layer parallelization architecture

## Closed-loop Re-planner



Closed-loop Re-planning architecture

## Cost-success decision

	Cost	Expected Success Rate	Cost-Success
<b>Recognition</b>			
Head	1	1	1
Torso	2	3	.66
Base	4	4	1
<b>Grasping</b>			
Head	1	.1	10
Torso	2	2	1
Base	4	8	.5

Cost based vs. cost-success based adaption

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## Conclusion

- Introduction to High-level planning
- Challenges
- 3-layered extension for parallel execution
- Closed loop extension for re-planning



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