

## **Automated Planning and Scheduling**

Lecture 1

Tomáš Balyo, Dominik Schreiber | October 18, 2018

# INSTITUTE OF THEORETICAL INFORMATICS

#### **Events**



- Lectures
  - Room 301
  - Every Thursday at 14:00
  - Please enroll to the lecture on http://campus.studium.kit.edu
- Exercises
  - Room -119
  - Every second Wednesday (starting 31.10.) at 14:00
- Exams
  - Oral/Written examination
  - Bonus points for homework improve the grade
  - Dates are flexible



#### **Homeworks and Lecture Notes**



- You get homework points for doing homework and showing up with them on the exercises
- You will have the possiblity to collect at least 120 points for homeworks during the semester (plus a lot more bonus points)
- You must collect at least 60 points to pass the exercises and be allowed to participate in the oral exam.
- Extra points improve your grade:
  - $ightharpoonup \geq$  70 points improves grade by 0.3
  - ightharpoonup  $\geq$  90 points improves grade by 0.7
  - ≥ 110 points improves grade by 1.0



#### Contact



- Tomas Balyo
  - mailto:tomas.balyo@kit.edu
  - room: 208
- Dominik Schreiber
  - mailto:dominik.schreiber@kit.edu
  - room: 209
- Homepage
  - https://baldur.iti.kit.edu/plan/
  - Contains all the slides and homework assignments

#### Goals of this lecture



- What is planning and scheduling?
  - Why is it important?
- How to use a Planner efficiently
  - How to encode your problems into PDDL
- How do Planners work
  - Algorithms
- How to make a Planner
  - Implementation techniques
- How do scheduling algorithms work



## Planning vs Scheduling



#### Planning

- given a description of the current state, a set of possible actions, and a desired state come up with a sequence of actions = plan that one can take to achieve the desired state.
- belongs to the category of Artificial Intelligence.
- high complexity, P-SPACE hard or even Undecidable.

#### Scheduling

- given a collection of actions and restricted resources decide how to execute all the actions in an efficient manner (create a schedule).
- belongs to the category of operations research.
- complexity typically in P and NP



## Planning Problem Example – Trucking





- Initial State
  - There is a truck and a package in city A
  - There is a package in city B
- Goal
  - There are two packages in city C
- Possible Actions
  - (Un)loading packages from/on the truck, driving between cities



## Planning Problem Example – Trucking





#### World State

- Truck at A, packages at A and B
- Truck at A with one package ...
- Truck at B ...
- Truck at B with both packages
- Truck at C with both packages
- both packages delivered to C

#### The Plan

- load package at A
- drive truck to B
- load the second package
- drive truck to C
- unload both packages

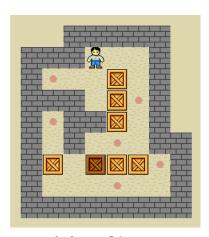


## **Another Planning Problem Example**



#### Sokoban

- Initial State
  - There is a worker and a bunch of boxes
- Goal
  - All the boxes must be in goal positions
- Possible Actions
  - moving with the worker
  - pushing a box
- Forbidden
  - to pull boxes
  - move through walls or boxes



www.sokobanonline.com



## **Scheduling Problem - School Timetable**



- Actions
  - There is given number of each kind of lesson that needs to take place
- Constraints
  - Teachers can teach certain subjects, only one at a time
  - Students need to take certains subjects
  - It must fit in a week
- Optimization Goals
  - Finish early each day (especially on fridays)
  - No holes in the schedule

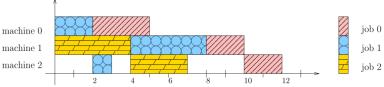
Monday	Tuesday	Wednesday	Thursday	Friday
A101 <b>English</b> 圓2	B102 Math	B009 <b>German</b> 🗉 1	B102 Math	A050 German 🗐
A101 <b>English 🗓</b> 2	B102 Math	B009 German 🖫 1	B102 Gym Math Spor	A101 English 🔯
	B302 Biology	A050 English 🖽 2	B103 Religion	A050 History
	B302 Biology	A050 History 🖺 1	B103 Religion	

## Job Shop Scheduling



- Actions
  - A job is a sequence of tasks, each task has a certain duration and must be executed on a specific machine.
- Constraints
  - A machine works on one task at a time uninterrupted
  - The tasks of a job are executed in the correct order without overlap
- Optimization Goal = finish as soon as possible

Example: job0 = [(0,3),(1,2),(2,2)], job1 = [(0,2),(2,1),(1,4], job2 = [(1,4),(2,3)]







## **Motivation - Aircraft Assembly**

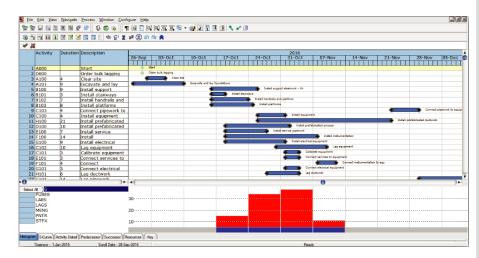


- 570 tasks, 17 resources
- A traditonal approach:
  - ARTEMIS
  - 20 hours to produce a schedule
- Intelligent Planning and Scheduling:
  - ARTEMIS substituted by a CSP
  - 30 minutes to generate an optimal schedule
  - 10-15% shorter makespan
- Savings:
  - 4 to 6 days shorter schedules
  - 200 000\$ −1 000 000\$ per day



#### **Artemis Scheduler**







#### **Motivation - Submarine Construction**



- 7000 tasks per boat, 125 resource classes
- A traditonal approach:
  - ARTEMIS
  - 6 weeks to produce a schedule (very non uniform)
- Intelligent Planning and Scheduling:
  - ARTEMIS substituted by a CSP
  - 2 days per schedule
  - uniform resource profile
- Savings:
  - 30% less overtime and sub-contracts



## **Motivation - Gulf War 1991 Logistics**



- A traditonal approach:
  - hundreds of human planners
  - months to generate the plans
- Intelligent Planning and Scheduling:
  - O-PLAN2 (a system combining planning and scheduling)
- Savings:
  - faster background creation
  - less flight missions
  - Financial savings that highly exceed all AI research supported by US government since 1956



#### **Motivation - Mars Rovers**



- Why automated planning and scheduling?
  - Communication delay 3-22 minutes one way
  - Comm. opportunity via orbiter only once a sol for about 8 minutes
  - Direct comm. to Earth only possible for few hours a day
- CASPER (Continuous Activity Scheduling, Planning, Execution and Re-planning) is the NASA's automated planning and scheduling component of OASIS (Onboard Autonomous Science Investigation System)
- Capabilities:
  - generation of a rover activity plan based on science priorities
  - handling of opportunistic science
  - modifying the rover activity plan in response to problems or other state and resource changes



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## **Restrictive assumptions of Planning**



#### Compared to the "Real World" in Classical Planning

- There are finitely many states and actions
- The world state is fully observable, the agent knows the current state
- Actions are deterministic, they only have one outcome
- The world is static, it only changes by the agents actions
- Goal is defined as a set of states
- Plan is defined as a sequence of actions



#### **Three Kinds of Planners**



- Domain—specific
  - A planner designed and developed for a specific planning domain.
  - Won't work well or at all for other planning domains.
  - Examples: Path finding algorithms, sokoban puzzle solver

#### Domain-independent

- A planner that works on any planning domain (given the restrictions on the previous slide).
- Correctness and completeness is guaranteed, but performance may be worse than a domain-spefic planner on its respective domain.

#### Configurable

- Domain independent engine, input includes info about efficient solving.
- One example of this HTN (Hierarchical Task Network) Planning.



## **Representation of Planning Problems**



A classical planning problem  $\pi = (S, A, s_l, s_G)$  is a tuple where

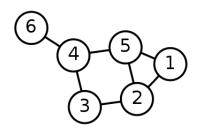
- lacksquare  ${\cal S}$  represents the final set of world states
- lacksquare  $\mathcal A$  represents the final set of actions
- $s_l \in \mathcal{S}$  represents the initial state
- $s_G \subset \mathcal{S}$  represents the set of goal states

A plan  $P = [a_1, a_2, ..., a_n]$  is a sequence of actions where  $a_i \in A$  that transforms the world state from  $s_i$  to a state  $s \in s_G$ .



## Example: pathfinding in a graph





 $\pi = (S, A, s_I, s_G)$  Explicit representation:

- ullet  $\mathcal{S} = \{at_1, at_2, at_3, at_4, at_5, at_6\}$
- $A = \{move(at_6, at_4), move(at_4, at_6), move(at_4, at_5), ...\}$
- $\bullet$   $s_l = at_1$
- $\bullet$   $s_G = \{at_6\}$

Plan  $P = [move(at_1, at_5), move(at_5, at_4), move(at_4, at_6)]$ 

## **Representation of World States**



- In general far too many states to represent explicitly
- We represent states as a set of features
  - a set of propositions that are true (PR Propositional rep.)
  - vector of values of finite domain variables (FDR finite dom. rep.)

#### Example

- PR propositions: Tr@A, Tr@B, Tr@C, P1@A, P2@A, P1@B, P2@B, P1@C, P2@C, P1-in-Truck, P1-in-Truck
- FDR variables: TruckLocation = {A|B|C}, Package1Location = {A|B|C|T}, Package2Location = {A|B|C|T}





## **Representation of Initial State**



Representing the Initial state is same as any other state

- A full description of a world state
- PR: set of all true propositions
- FDR: each variable has a value assigned from its domain

#### Example

- PR: Tr@A, P1@A, P2@B
- FDR: TruckLocation = A, Package1Location = A, Package2Location = B





## **Representation of Goal Conditions**

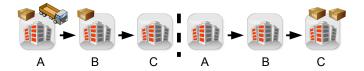


Goal conditions are represented as a partial state

- PR: set of true propositions same as any state
- FDR: some variables have a value assigned from their domains
- A state s is goal state if  $s \subseteq s_G$

#### Example

- PR: P1@C, P2@C
- FDR: Package1Location = C, Package2Location = C





## Representation of an Action



An action A = (pre, eff) is 2-tuple where

- pre represents the preconditions of the action, i.e., the conditions that must hold before the action is executed.
- eff represents the effects of the action, i.e., the conditions that must hold after the action is executed.
- PR: both pre and eff are sets of propositions
- FDR: both *pre* and *eff* are partial assignments to the FD variables

Example: action load package 1 in the truck at location A

- PR: Load1A =  $(\{Tr@A,P1@A\}, \{P1-in-Truck,\neg P1@A\})$
- FDR: Load1A = ({TruckLocation = A, Package1Location =
  A}, {Package1Location = T})



#### Valid Plan



Let  $\pi = (S, A, s_I, s_G)$  be a planning problem A plan  $P = [a_1, a_2, ..., a_n]$  is a valid plan for  $\pi$  if

- $\forall i: a_i \in \mathcal{A}$
- lacktriangle let  $s_1 = s_i$  and  $s_{i+1} = apply(s_i, a_i)$
- $\forall i$  :  $a_i$  is applicable in  $s_i$ , i.e.,  $pre(a_i) \subseteq s_i$
- $s_G \subseteq s_n$

where s' = apply(s, a) is the world state after applying action a in state s. The state s' is identical to s except for changes implied by the effects of a.



## Representation of all possible Actions



- List all the actions Explicit Representation
  - Can be a huge amount, but most of the time it's fine
  - Requires some script to generate the list, cannot be done by hand
  - Usually used with FDR
- Operators Action Templates Implicit Representation
  - Using objects, types and predicates define Action Templates

```
Example: operator for loading a package at some location
Types: location, package
Objects: P1, P2 - package, A,B,C - location
Predicates: at(P - package, L - location),
TruckAt(L - location), InTruck(P - package)
Operator:
loadPackage(P - package, L - location) = ({at(P,L),
```

TruckAt(L),  $\{\neg at(P,L), InTruck(P)\}$ )

## **Actions from Operators**



```
Types: location, package
Objects: P1, P2 - package, A,B,C - location
Predicates: PackageAt(P - package, L - location),
TruckAt(L - location), InTruck(P - package)
Operator:
loadPackage(P - package, L - location) =
({PackageAt(P,L), TruckAt(L)}, {¬PackageAt(P,L),
InTruck(P)})
```

The operator and objects generate these actions:

```
loadPackage(P1,A), loadPackage(P1,B), loadPackage(P1,C),
loadPackage(P2,A), loadPackage(P2,B), loadPackage(P2,C),
```





```
(define (domain trucking)
  (:requirements :strips :typing)
  (:types
        location - object
       package - object
  (:constants)
  (:predicates
     (road ?11 - location ?12 - location)
     (truck-at ?1 - location)
     (package-at ?p - package ?l - location)
     (in-truck ?p - package)
```



```
(:action loadPackage
  :parameters (?1 - location ?p - package)
  :precondition (and
      (package-at ?p ?1)
      (truck-at ?1)
  :effect(and
      (not (package-at ?p ?1))
      (in-truck ?p)
```



```
(:action unloadPackage
  :parameters (?1 - location ?p - package)
  :precondition (and
      (in-truck ?p)
      (truck-at ?1)
  :effect(and
      (not (in-truck ?p))
      (package-at ?p ?1)
```



```
(:action drive
  :parameters (?11 ?12 - location)
  :precondition (and
      (road ?11 ?12)
      (truck-at ?11)
  :effect(and
      (not (truck-at ?11))
      (truck-at ?12)
```



```
(define (problem trucking-3-cities-2-packages)
  (:domain trucking)
  (:requirements :strips :typing)
  (:objects
    11 12 13 - location
    p1 p2 - package
)
```



```
(:init
   (road 11 12)
   (road 12 13)
   (truck-at 11)
   (package-at p1 l1)
   (package-at p2 12)
(:goal (and
   (package-at p1 13)
   (package-at p2 13)
))
```

### The End



Next Week: Complexity of Planning

