

ASCoL: A Tool For Improving Automatic Planning Domain Model Acquisition

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Introduction

- Intelligent agents performing in the real-world use models of the world to plot their actions



NASA Mars Rover



Machine tool calibration



Robotics

- Hand-coded... time consuming, error prone
- Autonomous systems –LOCM, ARMS, Opmaker,...
- Challenges: Input to output ratio

Limitations of Learning Systems

- LOCM (ICAPS 2009 by Cresswell, McCluskey and West) :
 - Learns domain models from logged sequences of actions (plans) only
 - No need for information like predicate specification or state information
 - Declare Static facts manually

```
sequence_task(15, [board(c12, l2), sail(l2, l1), debark(c12, l1), board(c1, l1), sail(l1, l3), debark(c1, l3), board(c11, l3), sail(l3, l4), debark(c11, l4), board(c3, l4), sail(l4, l1), debark(c3, l1), board(c2, l1), sail(l1, l3), debark(c2, l3), board(c24, l3), sail(l3, l4), debark(c24, l4), board(c9, l4), sail(l4, l2), debark(c9, l2), board(c15, l2), sail(l2, l0), debark(c15, l0), board(c4, l0), sail(l0, l4), debark(c4, l4), board(c10, l4), sail(l4, l0), debark(c10, l0), board(c6, l0), sail(l0, l4), debark(c6, l4), board(c14, l4), sail(l4, l1), debark(c14, l1), board(c8, l1), sail(l1, l3), debark(c8, l3), board(c25, l3), sail(l3, l0), debark(c25, l0), board(c13, l0), sail(l0, l2), debark(c13, l2), board(c17, l2), sail(l2, l0), debark(c17, l0), board(c21, l0), sail(l0, l1), debark(c21, l1), board(c16, l1), sail(l1, l4), debark(c16, l4), board(c18, l4), sail(l4, l0), debark(c18, l0), board(c26, l0), sail(l0, l3), debark(c26, l3)], _, _). ....
```

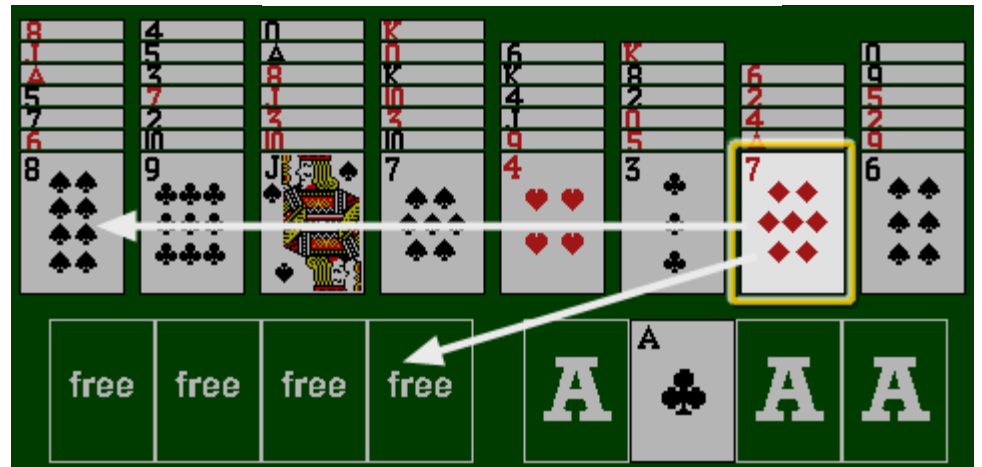
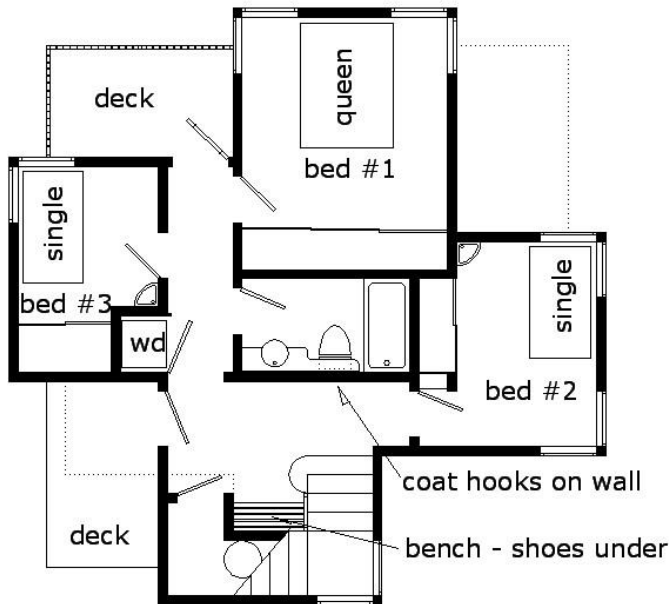
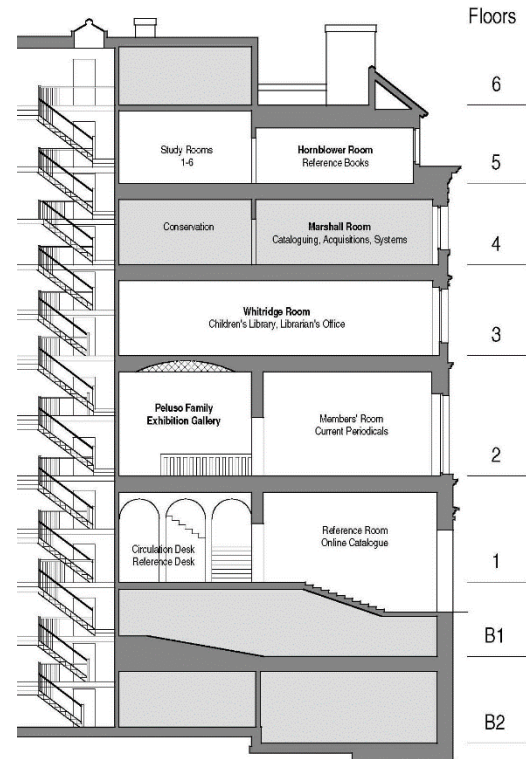
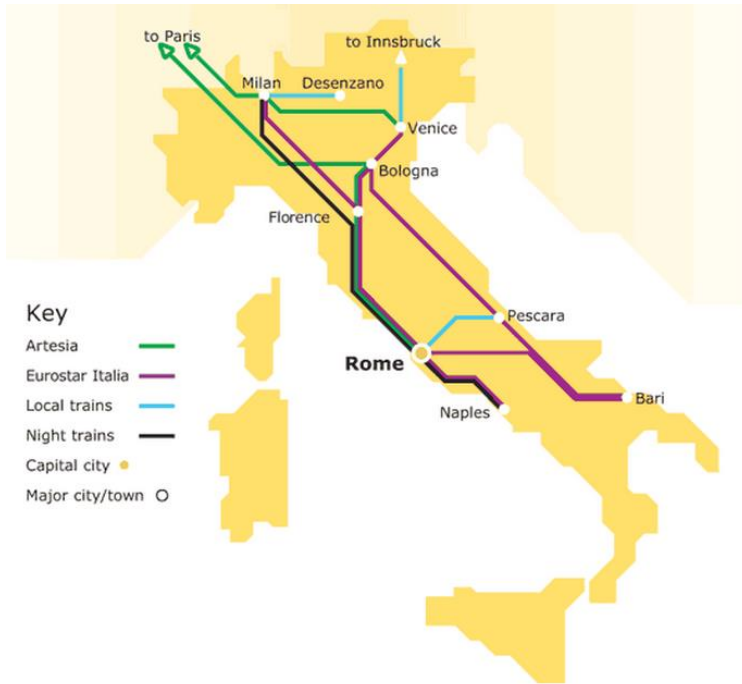
“The only exception to this is the option to specify a “static” precondition, necessary in some domains which require static knowledge.”

(Cresswell et al., 2013)

Static Knowledge – What is it?

Relationships/properties that never change in the world and are implicit in the domain model but would not be directly expressed in plan traces

- Appear only in preconditions only
- Restricts values of variables
- E.g. layout of roads, level of floors, fixed relationships between specific cards in *freecell*, ...



ASCoL (Automated Static Constraint Learner)

- Exploits graph analysis for automatically **identifying static relations** to enhance planning domain models by observing a set of training plan traces
- We enhance the output domain model of the LOCM system to capture static domain constraints from the same set of input training plans as used by LOCM

ASCoL -The learning problem

Input plan traces contain tacit knowledge about constraints validation/acquisition

```
...,sendtofree(club8,diamond4,n2,n1),sendtofree(spade9,heart7,n1,n0),move(heart7,diamonda,spade8),sendtohome(diamonda,spade3,diamond,n1,diamond0,n0),move(diamond4,diamond9,club5),colfromfreecell(club8,diamond9,n0,n1),move(diamond7,heart4,club8),sendtofree(heart6,cluba,n1,n0),sendtohome(cluba,club2,club,n1,club0,n0),sendtohome(club2,club9,club,n2,cluba,n1),move(spade3,heart5,diamond4),move(spade4,diamond3,heart5),move(diamond3,club4,spade4),colfromfreecell(heart8,club9,n0,n1),sendtofree(club4,club6,n1,n0),move(club6,club3,heart7),sendtohome_b(club3,club,n3,club2,n2,n0,n1),homefromfreecell(club4,club,n4,club3,n3,n0,n1),sendtonewcol(spade3,diamond4,n1,n0),...
```



ASCoL



Static Preconditions (Constraints)

Successor_card(heart9, spade8)

...

Every domain has separate static background

Input : a tuple (P, T), **P** = plan traces , **T** = types of action arguments in P

Output : **R** = constraint repository

Methodology

1. Input Action Sequence

...,sendtofree(club8,diamond4,n2,n1),sendtofree(spade9,heart7,n1,n0),move(heart7,diamonda,spade8),sendtohome(diamonda,spade3,diamond,n1,diamond0,n0),move(diamond4,diamond9,club5),colfromfreecell(club8,diamond9,n0,n1),move(diamond7,heart4,club8),sendtofree(heart6,cluba,n1,n0),sendtohome(cluba,club2,club,n1,club0,n0),sendtohome(club2,club9,club,n2,cluba,n1),move(spade3,heart5,diamond4),move(spade4,diamond3,heart5),move(diamond3,club4,spade4),colfromfreecell(heart8,club9,n0,n1),sendtofree(club4,club6,n1,n0),move(club6,club3,heart7),sendtohome_b(club3,club,n3,club2,n2,n0,n1),homefromfreecell(club4,club,n4,club3,n3,n0,n1),sendtonewcol(spade3,diamond4,n1,n0),...

$A_i(O_{i1}, \dots, O_{ij})$ for $i = 1, \dots, N$

2. An action arguments' pairing based on same-type rule

sendtofree-b(cardX **-card** N1 N0 N3 N4 **-num**)

Pair1 (N1, N0), Pair2 (N1, N3), Pair3 (N1, N4),
Pair4 (N0, N3), Pair5 (N0, N4), Pair6 (N3, N4).

3. Multiple instances of an action in input

...
sendtofree-b (cardX N1 N0 N3 N4)
sendtofree-b (cardY N2 N1 N2 N3)

...

4. Graph edges in Conn set for pair1

$Conn = \{ \dots (N1, N0), (N2, N1) \dots \}$

5. The directed graph of pair1

...N2 → N1 → N0...

Evaluation

number of operators (**# Operators**), total number of static relations (**# SR**) are presented, number of identified static relationships (**Learnt SR**), number of additional static relations provided (**Additional SR**), number of plans (**#Plans**), average number of actions per plan (**A/P**), **CPU-time** in milliseconds

Domain	# Operators	# SR	Learnt SR	Additional SR	# Plans	Avg. A/P	CPU-time (ms)
TPP	4	7	7	0	7	28	171
Zenotravel	5	4	6	2	4	24	109
Miconic	4	2	2	0	1	177	143
Storage	5	5	5	0	24	15	175
Freecell	10	19	13	0	20	60	320
Hanoi	1	0	1	1	1	60	140
Logistics	6	0	1	1	3	12	98
Driverlog	6	2	2	0	3	12	35
Mprime	4	7	7	0	10	30	190
Spanner	3	1	1	0	1	8	144
Gripper	3	0	1	1	1	14	10
Ferry	3	1	2	1	1	18	130
Barman	12	3	3	0	1	150	158
Gold-miner	7	3	1	0	13	20	128
Trucks	4	3	3	0	6	25	158

- Input plans generated using **Metric-FF planner** on randomly generated problems
- Implemented in Java, and run on a **Core 2 Duo/8GB** processor

Thank you