

# Abstractions += Landmarks

C. Domshlak   M. Katz   S. Lefler

Faculty of Industrial Engineering and Management  
Technion - Israel Institute of Technology

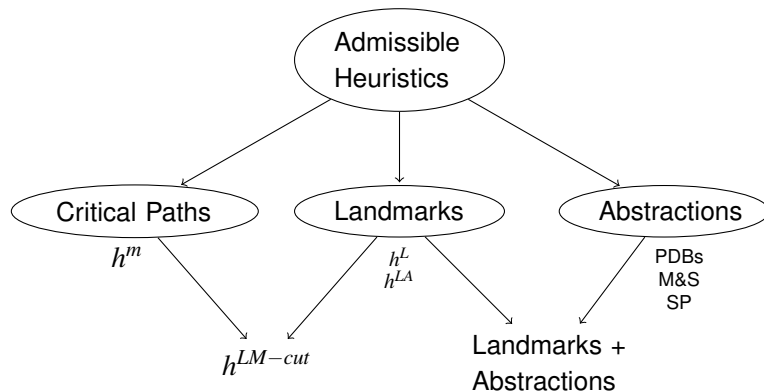
Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Context



Background

Planning

Forks

Landmarks

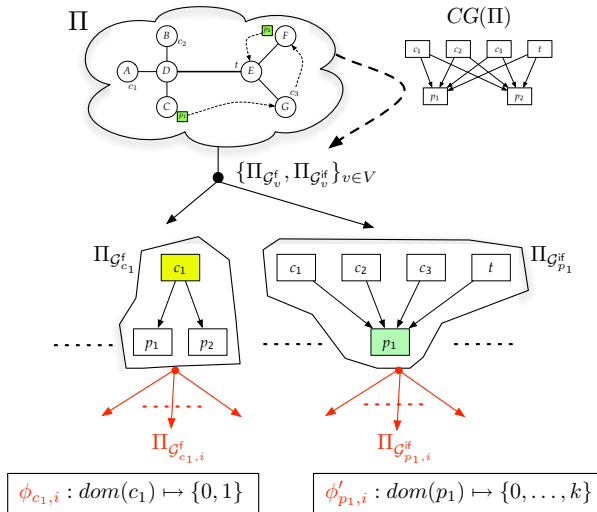
LM Enriched  
Task

Experimental  
Evaluation

Summary

# Fork Abstractions

(K & Domshlak, ICAPS08)



+ ensuring proper **action cost partitioning**

Background

Planning

Forks

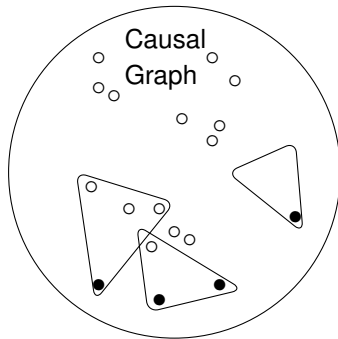
Landmarks

LM Enriched Task

Experimental Evaluation

Summary

# Goal Sensitivity



Background

Planning

Forks

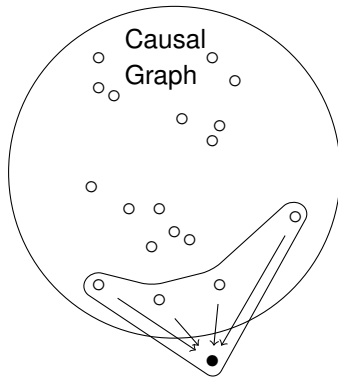
Landmarks

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Goal Sensitivity



Background

Planning

**Forks**

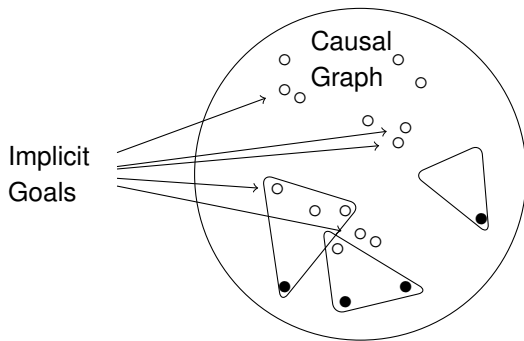
Landmarks

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Goal Sensitivity



Background

Planning

Forks

Landmarks

LM Enriched  
Task

Experimental  
Evaluation

Summary

Landmark = Implicit Goal

- A **landmark** is a fact that must be true at some point in **every** valid plan (Hoffmann, Porteous and Sebastia 2004)
- *Some* landmarks can be discovered automatically (Hoffmann, Porteous and Sebastia 2004, Richter, Helmert and Westphal 2008)

Background

Planning

Forks

Landmarks

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task

Classical Planning Task

$$\Pi = \langle V, A, \mathcal{C}, I, G \rangle$$



Background

LM Enriched  
Task

Experimental  
Evaluation

Summary



# Enriching Planning Task

Classical Planning Task

$$\Pi = \langle V, A, \mathcal{C}, I, G \rangle$$



Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task

Classical Planning Task

$$\Pi = \langle V, A, \mathcal{C}, I, G \rangle$$



Landmarks Set

$$L = \{l_1 \dots l_k\}$$



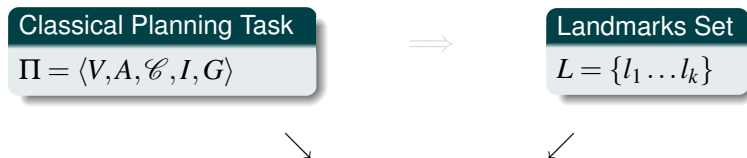
Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task



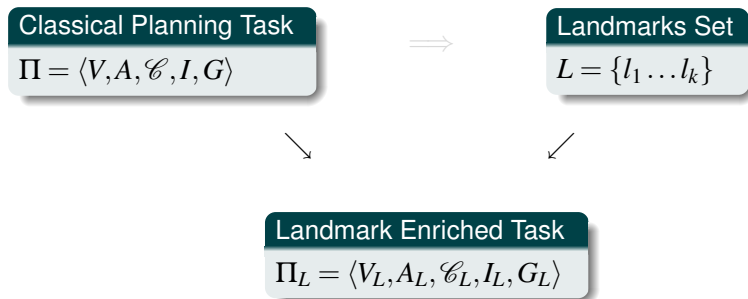
Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task



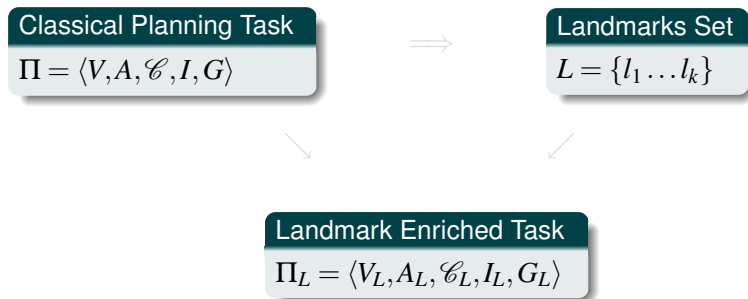
Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task



- 1 Solve  $\Pi_L$  instead of solving  $\Pi$

Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Using Landmarks

- Given state  $s$ , the number of “to be achieved from  $s$ ” landmarks  $|L(s)|$  can be used as an (inadmissible) estimate (Richter et. al.)
  - ♠ used by *LAMA* - a state of the art satisficing planner, and winner of the IPC-2008 sequential satisficing track
  - ♠ proper cost partitioning between landmarks  $\Rightarrow$  **admissible** estimate (Karpas & Domshlak, IJCAI09)
- **multi-path-dependent** search **LM-A\*** (Karpas & Domshlak, IJCAI09) maintains the “to be achieved from  $s$ ” landmark sets  $L(s)$  **well**

Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Using Landmarks

- Given state  $s$ , the number of “to be achieved from  $s$ ” landmarks  $|L(s)|$  can be used as an (inadmissible) estimate (Richter et. al.)
  - ♠ used by *LAMA* - a state of the art satisficing planner, and winner of the IPC-2008 sequential satisficing track
  - ♠ proper cost partitioning between landmarks  $\Rightarrow$  **admissible** estimate (Karpas & Domshlak, IJCAI09)
- **multi-path-dependent** search **LM-A\*** (Karpas & Domshlak, IJCAI09) maintains the “to be achieved from  $s$ ” landmark sets  $L(s)$  **well**

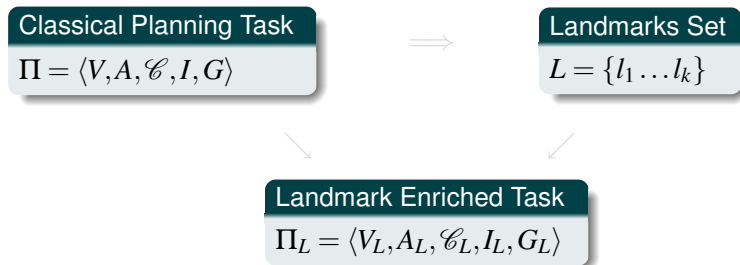
Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Enriching Planning Task



- 1 Solve  $\Pi_L$  instead of solving  $\Pi$

Background

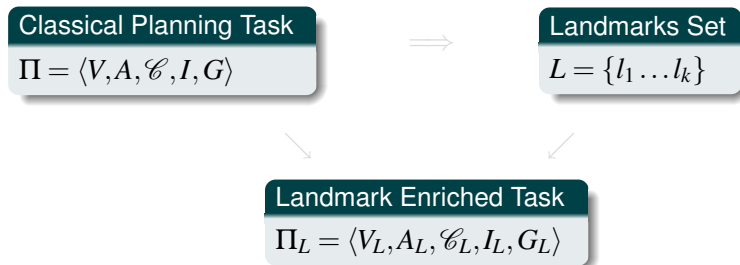
LM Enriched  
Task

Experimental  
Evaluation

Summary



# Enriching Planning Task



- 1 Solve  $\Pi_L$  instead of solving  $\Pi$
- 2 Solve  $\Pi$  while using  $\Pi_L$  for heuristic estimate
  - Run LM-A\* on  $\Pi$
  - Given state  $s$  of  $\Pi$  and “to be achieved from  $s$ ” landmarks  $L(s)$ 
    - map  $(s, L(s))$  to the corresponding state  $s'$  of  $\Pi_L$
    - compute  $h^{\mathcal{F}}(s')$  [wrt  $\Pi_L$ ]

Background

LM Enriched  
Task

Experimental  
Evaluation

Summary

# Evaluation

domain ( $\mathcal{D}$ )	$h^{\mathcal{F}}$	$h^{\mathcal{F}}$ on $\Pi_L$		$LM-h^{\mathcal{F}}$	
	$s$	$s$	%S	$s$	%S
airport-ipc4 (17)	20	18	0.76	17	0.64
blocks-ipc2 (17)	21	18	78.21	17	12.19
depots-ipc3 (4)	7	4	5.80	4	1.33
driverlog-ipc3 (10)	12	11	1.26	11	0.67
freecell-ipc3 (5)	5	5	0.28	5	0.29
grid-ipc1 (2)	2	2	0.52	2	0.10
gripper-ipc1 (5)	7	5	23.34	6	0.84
logistics-ipc1 (5)	6	6	1.19	5	0.61
logistics-ipc2 (20)	22	20	24.21	20	28.47
miconic-strips-ipc2 (48)	51	52	0.63	108	0.17
mprime-ipc1 (22)	23	22	12.21	23	4.46
mystery-ipc1 (20)	20	20	2.59	20	1.14
openstacks-ipc5 (7)	7	7	0.18	7	0.18
pathways-ipc5 (4)	4	4	1.00	4	1.00
pipesworld-notankage-ipc4 (15)	16	15	1.42	15	0.64
pipesworld-tankage-ipc4 (10)	10	10	1.57	10	0.67
psr-small-ipc4 (48)	49	49	1.01	48	0.99
rovers-ipc5 (5)	6	6	0.43	5	0.40
satellite-ipc4 (6)	6	7	0.35	7	0.17
tpp-ipc5 (5)	6	6	1.21	5	1.21
trucks-ipc5 (6)	6	7	0.30	7	0.14
zenotravel-ipc3 (9)	11	9	1.12	9	0.59
$s(p)$	317	303		355	

Background

LM Enriched  
Task

Experimental  
Evaluation

Summary



%S denotes the average of ratios of expanded nodes.

# Summary

## Conclusions

- 1 Additional information from landmarks integrated into planning task increases informativeness
- 2 Landmark enriched heuristics should use landmark enriched search procedures

Background

LM Enriched  
Task

Experimental  
Evaluation

Summary