

When Abstractions Met Landmarks



C. Domshlak M. Katz S. Lefler

Technion - Israel Institute of Technology

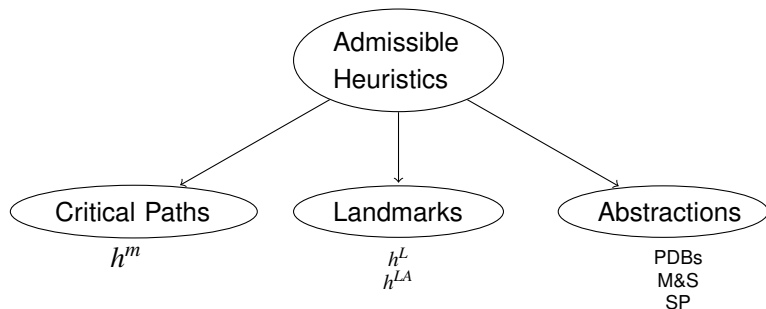
Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Context



Background

Planning

Forks

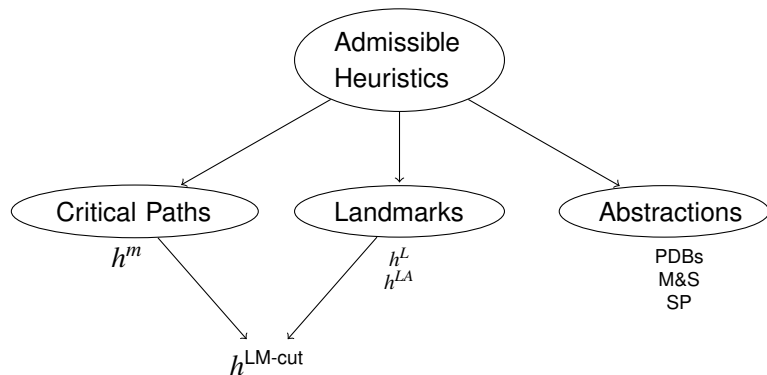
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Context



Background

Planning

Forks

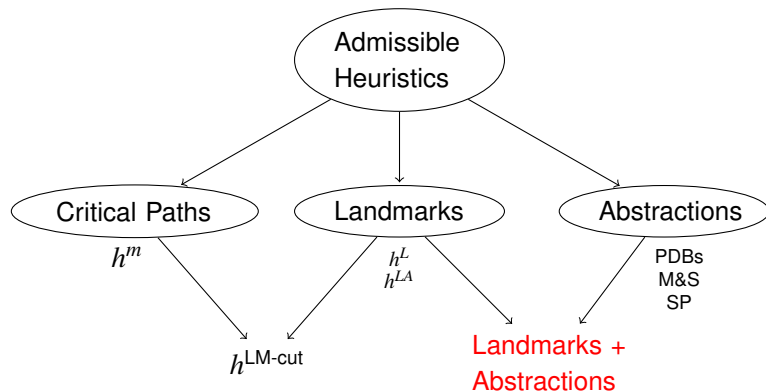
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Context



Background

Planning

Forks

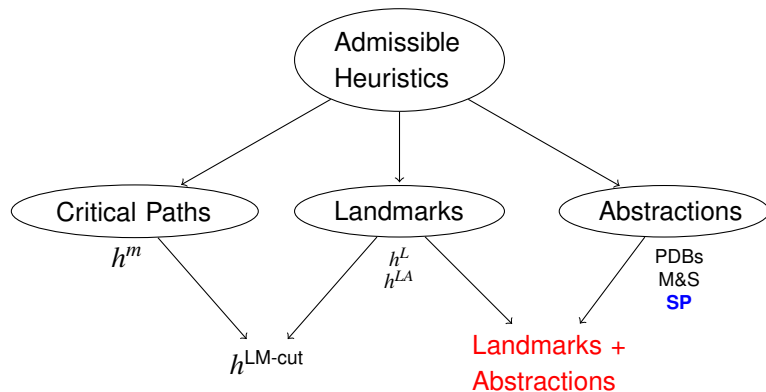
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Context



Background

Planning

Forks

Landmarks

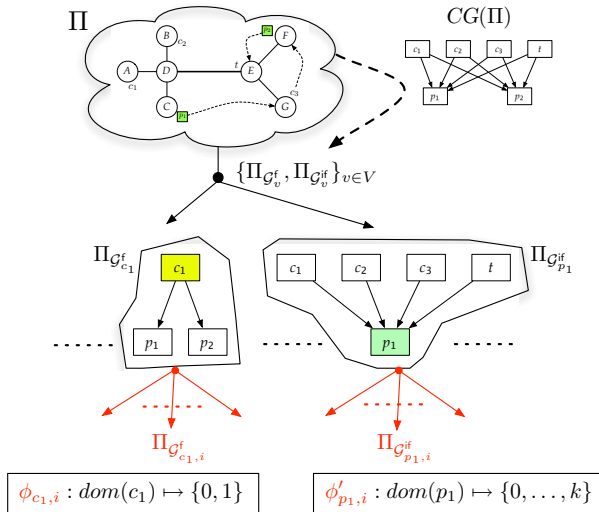
LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Implicit Abstractions - Fork Decomposition

(Katz & Domshlak, ICAPS08,09)



+ ensuring proper **action cost partitioning**

Background

Planning

Forks

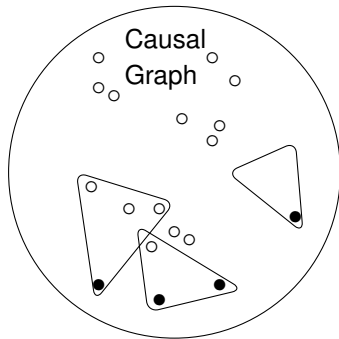
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Goal Sensitivity



Background

Planning

Forks

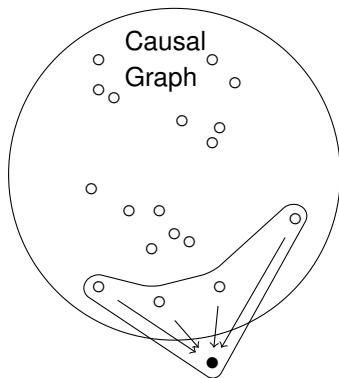
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Goal Sensitivity



Background

Planning

Forks

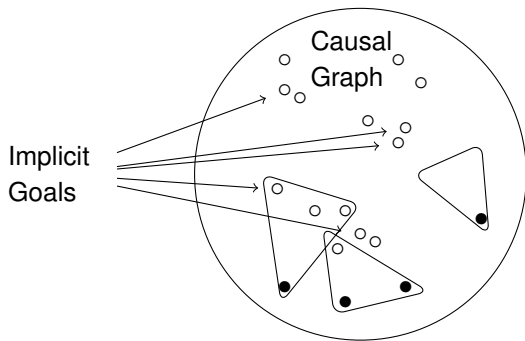
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Goal Sensitivity



Landmark = Implicit Goal

Background

Planning

Forks

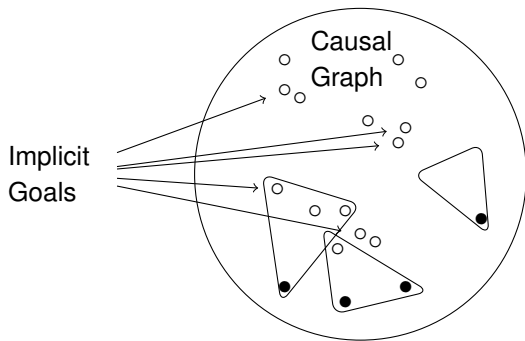
Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Goal Sensitivity



Landmark = Implicit Goal

Background

Planning

Forks

Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

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, Sebastia 2004
 - Zhu, Givan 2005
 - Richter, Helmert, Westphal 2008
 - Helmert, Domshlak, 2009
 - ...

Background

Planning

Forks

Landmarks

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Enriching Planning Task

Classical Planning Task

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

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Enriching Planning Task

Classical Planning Task

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



Landmarks Set

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

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Enriching Planning Task

Classical Planning Task

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

Landmarks Set

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



Landmark Enriched Task

$$\Pi^L = \langle V^L, A^L, I^L, G^L, C^L \rangle$$

Background

LM Enriched Task

Experimental Evaluation

Summary and Future Work

Enriching Planning Task

Classical Planning Task

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

Landmarks Set

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



Landmark Enriched Task

$$\Pi^L = \langle V^L, A^L, I^L, G^L, C^L \rangle$$

- 1 Solve Π^L instead of solving Π

Background

LM Enriched Task

Experimental Evaluation

Summary and Future Work

Landmark-based Heuristics

- Given state s , the number of “to be achieved from s ” landmarks $|L(s)|$ can be used as an (inadmissible) estimate (Richter, Helmert, Westphal, 2008)
 - ♠ 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 and
Future Work

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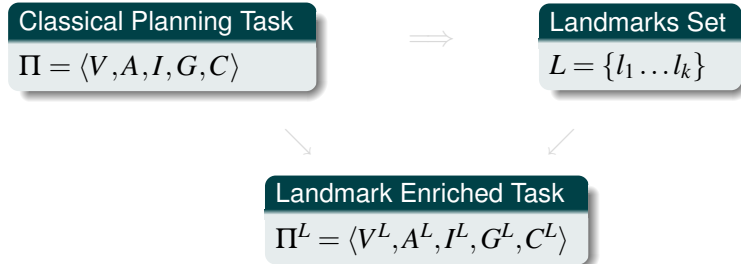
Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Enriching Planning Task



- 1 Solve Π^L instead of solving Π

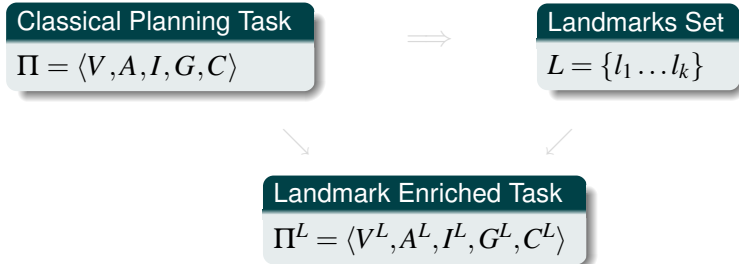
Background

LM Enriched Task

Experimental Evaluation

Summary and Future Work

Enriching Planning Task



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

Background

LM Enriched Task

Experimental Evaluation

Summary and Future Work

Evaluation - Forks

domain (\mathcal{D})	A^*/h on Π		A^*/h on Π^L		$LM-A^*$	
	s	E	s	E	s	E
airport-ipc4	20	13.86	18	14.96	17	17.00
blocks-ipc2	21	20.60	18	3.59	17	5.58
depots-ipc3	7	6.59	4	1.06	4	2.97
driverlog-ipc3	12	7.64	11	5.89	11	10.84
freecell-ipc3	5	1.32	5	4.58	5	4.83
grid-ipc1	2	0.20	2	0.39	2	2.00
gripper-ipc1	7	6.22	5	0.50	6	6.00
logistics-ipc1	6	2.35	6	2.44	5	3.81
logistics-ipc2	22	22.00	20	11.91	20	11.42
miconic-strips-ipc2	51	8.17	52	14.68	108	108.00
mprime-ipc1	23	9.87	22	15.38	23	18.21
mystery-ipc1	21	11.13	21	9.67	21	14.12
openstacks-ipc5	7	1.26	7	7.00	7	6.97
pathways-ipc5	4	3.99	4	4.00	4	3.99
pipes-notank-ipc4	16	10.61	15	7.79	15	15.00
pipes-tank-ipc4	10	6.75	10	5.20	10	10.00
psr-small-ipc4	49	48.56	49	48.07	48	47.98
rovers-ipc5	6	2.97	6	5.71	5	4.90
satellite-ipc4	6	1.01	7	3.08	7	7.00
schedule-strips	46	43.61	46	42.38	46	43.61
tpp-ipc5	6	6.00	6	5.48	5	4.49
trucks-ipc5	6	0.84	7	2.92	7	7.00
zenotravel-ipc3	11	7.31	9	5.05	9	9.00
	364	242.85	350	221.72	402	364.72

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Evaluation - Cost Partition

LM-A* with Forks

domain (\mathcal{D})	Optimal		Uniform		Optimal for I	
	s	E	s	E	s	E
airport-ipc4	7	6.77	17	16.52	17	16.52
blocks-ipc2	13	13.00	17	8.37	17	9.17
depots-ipc3	1	1.00	4	3.22	4	3.48
driverlog-ipc3	6	5.28	11	5.70	11	7.07
freecell-ipc3	2	2.00	5	3.07	5	3.87
grid-ipc1	0	0.00	2	2.00	2	2.00
gripper-ipc1	2	1.85	6	5.55	6	6.00
logistics-ipc1	2	2.00	5	3.42	5	3.97
logistics-ipc2	17	17.00	20	14.20	20	14.22
miconic-strips-ipc2	90	89.91	108	76.30	108	80.20
mprime-ipc1	9	8.89	23	15.32	23	19.30
mystery-ipc1	11	10.50	21	17.34	21	18.80
openstacks-ipc5	5	4.99	7	2.50	7	7.00
pathways-ipc5	4	4.00	4	2.36	4	3.98
pipes-notank-ipc4	3	3.00	15	10.00	15	14.19
pipes-tank-ipc4	2	2.00	10	6.52	10	9.62
psr-small-ipc4	40	40.00	48	34.96	48	27.29
rovers-ipc5	4	4.00	5	3.07	7	5.66
satellite-ipc4	5	5.00	7	3.59	7	3.27
schedule-strips	33	32.93	46	26.15	47	23.00
tpp-ipc5	5	5.00	5	4.02	5	5.00
trucks-ipc5	4	4.00	7	3.39	8	4.91
zenotravel-ipc3	7	7.00	9	3.36	11	7.79
	272	270.12	402	270.93	408	296.32

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

Evaluation - Merge & Shrink

domain (\mathcal{D})	A^*/h on Π		A^*/h on Π^L		$LM-A^*$	
	s	E	s	E	s	E
airport-ipc4	17	14.90	15	12.91	16	16.00
blocks-ipc2	18	10.88	20	16.33	18	15.82
depots-ipc3	7	6.17	6	3.91	4	3.89
driverlog-ipc3	12	9.12	11	8.46	11	10.08
freecell-ipc3	4	2.67	4	3.99	4	2.81
grid-ipc1	2	1.12	2	0.76	1	1.00
gripper-ipc1	7	6.91	4	1.12	6	5.01
logistics-ipc1	4	2.67	3	0.49	3	2.12
logistics-ipc2	16	15.03	16	10.61	14	10.84
miconic-strips-ipc2	55	45.87	44	32.97	63	58.04
mprime-ipc1	21	13.85	17	12.14	20	16.31
mystery-ipc1	17	13.96	16	12.25	19	14.91
openstacks-ipc5	7	6.96	7	7.00	7	1.96
pathways-ipc5	4	4.00	4	3.08	4	4.00
pipes-notank-ipc4	21	18.68	16	12.28	15	12.44
pipes-tank-ipc4	13	11.77	12	7.68	13	10.97
psr-small-ipc4	50	49.09	50	49.40	49	43.42
rovers-ipc5	6	5.18	6	5.19	5	5.00
satellite-ipc4	6	3.25	5	3.17	7	7.00
schedule-strips	19	19.00	19	19.00	19	19.00
tpp-ipc5	6	5.37	6	5.78	6	6.00
trucks-ipc5	5	4.45	4	2.76	4	2.01
zenotravel-ipc3	11	9.36	9	7.58	9	9.00
	328	280.26	296	238.85	317	277.62

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

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Conclusions

- 1 (At least implicit) abstractions and landmarks can be friends
- 2 Want to use landmark-enriched abstraction heuristic?
~> Try the "search here, evaluate there" scheme

Future Work

- 1 Successful dating between landmarks and **explicit** abstractions
- 2 Other methods for landmarks compilation, exploiting action landmarks, ...

Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work

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Background

LM Enriched
Task

Experimental
Evaluation

Summary and
Future Work