

# Pattern Database Heuristics for Greedy Search

Carmen St. Jean

# Proposal

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## ■ Proposal

■ Algorithm:  
Greedy Search

■ Domain:  
*N*-Puzzle

■ Pattern Databases

■ *N*-Puzzle PDBs

■ Fringe Abstraction

■ Special  
Abstraction

■ Insight into  
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■ Results

Greedy search will solve the sliding tile puzzle better with the fringe pattern database than a more specialized pattern database as a heuristic.

# Algorithm: Greedy Search

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Assume  $b$  is branching factor and  $m$  is maximum depth.

- Best-first search with queue ordered by heuristic value
- Complete in finite spaces
- Inadmissible
- $b^m$  time
- $b^m$  space

# Algorithm: Greedy Search

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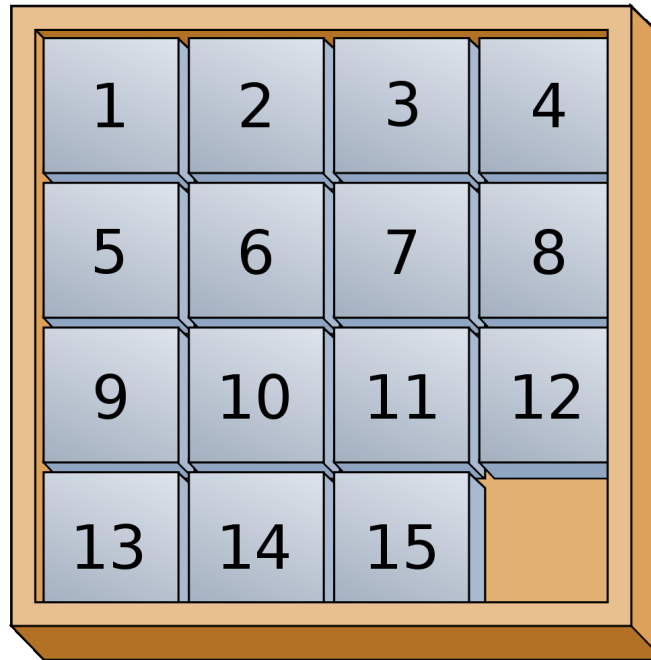
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Assume  $b$  is branching factor and  $m$  is maximum depth.

- Best-first search with queue ordered by heuristic value
- Complete in finite spaces
- Inadmissible
- $b^m$  time
- $b^m$  space
- **Tends to yield suboptimal solutions in a reasonable time**

# Domain: $N$ -Puzzle

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- $N$  numbered square tiles, one blank tile
- Objective: rearrange tiles by sliding the blank space to reach goal configuration
- Commonly solved with A\* using Manhattan Distance heuristic

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- A *pattern* is a partial specification of a state

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- A *pattern* is a partial specification of a state
  - ◆ Some elements of the state are abstracted

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- A *pattern* is a partial specification of a state
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- A *target pattern* is a partial specification of the goal state



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- A *pattern* is a partial specification of a state
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- A *target pattern* is a partial specification of the goal state
- A *pattern database* is set of all patterns obtained by permuting the target pattern

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- Every pattern knows its exact solution cost for the target pattern

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- Every pattern knows its exact solution cost for the target pattern
  - ◆ Admissible heuristic

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- Abstract away some tiles

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- Abstract away some tiles
- Can be more accurate than Manhattan distance

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- Can use multiple disjoint pattern databases at once

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- Lots of different abstractions possible

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  - ◆ Fringe abstraction (outer edge)
  - ◆ Special abstraction (keep tiles furthest from goal position)



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- Less tiles abstracted, more powerful pattern database

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- Can be more accurate than Manhattan distance
- Can use multiple disjoint pattern databases at once
- Lots of different abstractions possible
  - ◆ Fringe abstraction (outer edge)
  - ◆ Special abstraction (keep tiles furthest from goal position)
- Less tiles abstracted, more powerful pattern database
- More timely to calculate and larger space required when fewer tiles are abstracted

Independent of start configuration.

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# Fringe Abstraction

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Independent of start configuration.

	1	2	3
4	5	6	7
8	9	10	11

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Independent of start configuration.

	1	2	3		A	2	3		A	A	A
4	5	6	7	A	A	6	7	A	A	A	A
8	9	10	11	A	A	A	A	8	9	10	11

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	1	2	3
4	5	6	7
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	A	2	3
A	A	6	7
A	A	A	A

	A	A	A
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8	9	10	11

Example:

2	6	3	4
10	9	5	
8	7	1	11

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8	9	10	11	A	A	A	A	8	9	10	11

Example:

2	6	3	4	2	6	3	A	A	A	A	A
10	9	5		A	A	A		10	9	A	
8	7	1	11	A	7	A	A	8	A	A	11

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Example:

2	6	3	4	2	6	3	A	A	A	A	A
10	9	5		A	A	A		10	9	A	
8	7	1	11	A	7	A	A	8	A	A	11

Heuristic value of state:

$$h = \text{cost} + \text{cost}$$



# Special Abstraction

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Created for a specific start configuration, using the eight tiles furthest from their goal positions.

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2	6	3	4
10	9	5	
8	7	1	11

$2_2$	$6_2$	$3_1$	$4_4$
$10_3$	$9_1$	$5_1$	
$8_0$	$7_3$	$1_3$	$11_0$

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$8_0$	$7_3$	$1_3$	$11_0$

A	A	A	4
10	A	A	
A	7	1	A

2	6	3	A
A	A	5	
A	A	A	A

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	1	2	3
4	5	6	7
8	9	10	11

A	A	A	4
10	A	A	
A	7	1	A

	1	A	A
4	A	A	7
A	A	10	A

2	6	3	A
A	A	5	
A	A	A	A

	A	2	3
A	5	6	A
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Greedy search will solve the sliding tile puzzle better with the fringe pattern database than a more specialized pattern database as a heuristic.

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Why?



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- ◆ Solving remaining tiles will not disturb solved tiles

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- ◆  $h = 0$  means you're actually close to the goal

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- Specialized

- ◆ Solving remaining tiles might disturb solved tiles

Greedy search will solve the sliding tile puzzle better with the fringe pattern database than a more specialized pattern database as a heuristic.

Why?

- Fringe

- ◆ Solving remaining tiles will not disturb solved tiles
- ◆  $h = 0$  means you're actually close to the goal

- Specialized

- ◆ Solving remaining tiles might disturb solved tiles
- ◆  $h = 0$  does not guarantee you're close to the goal

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	Greedy	A*
Fringe	44,171	218,816
Specialized	196,073	333,928

Table 1: Number Nodes Expanded

# Results

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This shows:

- Fringe is better than specialized for both greedy and A\* on puzzles of this size



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This shows:

- Fringe is better than specialized for both greedy and A\* on puzzles of this size
- Previously, it was shown specialized works better on big puzzles with big pattern databases, this does not generalize to smaller puzzles with disjoint pattern databases

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This shows:

- Fringe is better than specialized for both greedy and A\* on puzzles of this size
- Previously, it was shown specialized works better on big puzzles with big pattern databases, this does not generalize to smaller puzzles with disjoint pattern databases (Which one?)