

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

1 handout: slides

EOLQs

■ EOLQs

■ Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

Are We Done?

■ EOLQs

■ Are We Done?

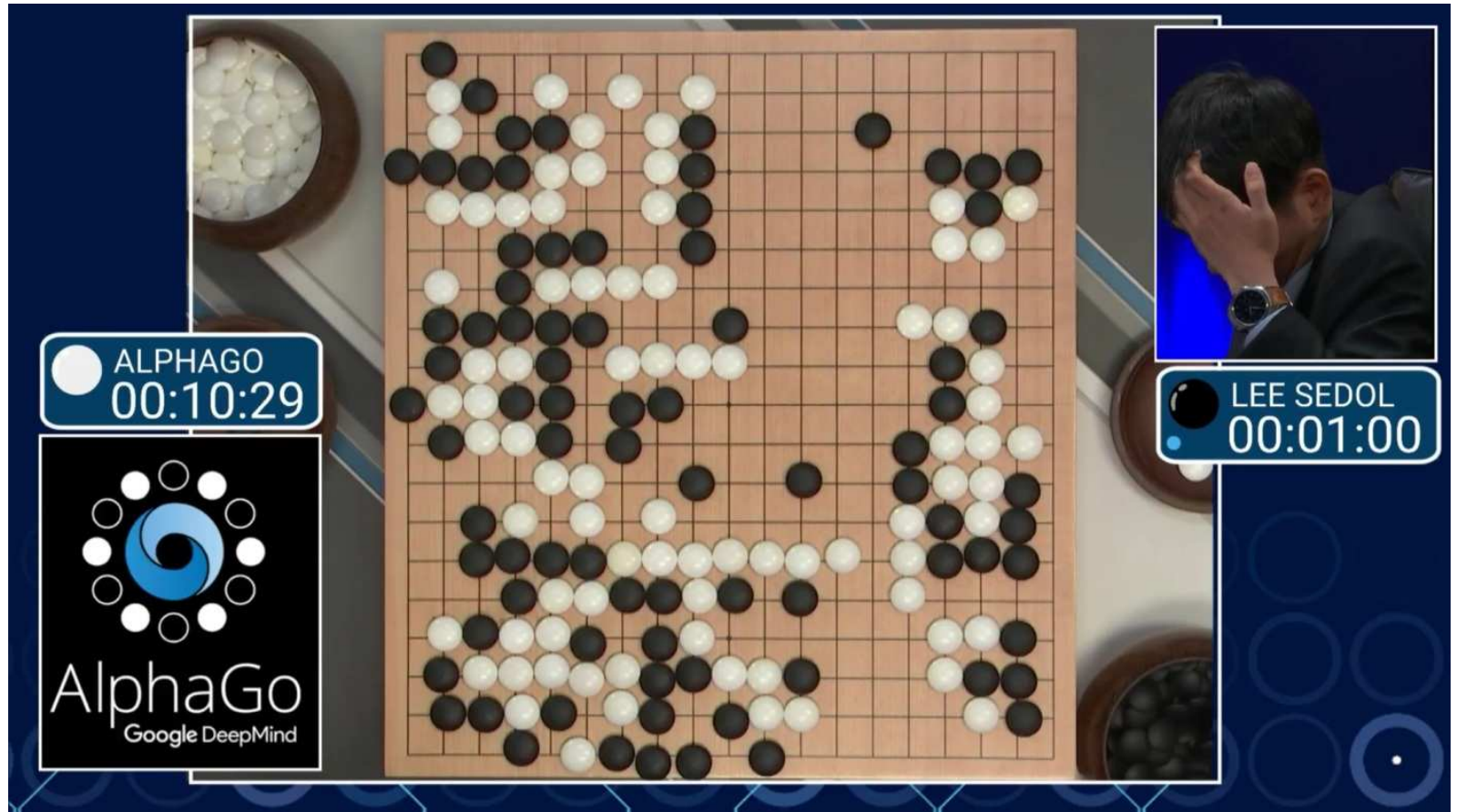
Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

EOLQs



- EOLQs
- Are We Done?

Beyond A*

- GBFS
- 8-puzzle
- Evaluating Greedy
- Beam Search

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

Beyond A*

Greedy Best-first Search (GBFS)

- EOLQs
- Are We Done?

Beyond A*

■ GBFS

- 8-puzzle
- Evaluating Greedy
- Beam Search

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

$Q \leftarrow$ an ordered list containing just the initial state.

Loop

If Q is empty,
then return failure.

$Node \leftarrow \text{Pop}(Q)$.

If $Node$ is a goal,
then return $Node$ (or path to it)

else

$Children \leftarrow \text{Expand}(Node)$.

Merge $Children$ into Q , keeping **sorted by heuristic**. \leftarrow

GBFS on the 8-puzzle

$h(n)$ = number of tiles out of place. (The blank is not a tile.)

	2	8	3		1	2	3
Start state:	1	6	4	Goal state:	8	□	4
	7	□	5		7	6	5

Please draw the tree resulting from the first two node expansions.

- EOLQs
- Are We Done?
- Beyond A*
- GBFS
- 8-puzzle
- Evaluating Greedy
- Beam Search

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

Evaluating Greedy

- EOLQs
- Are We Done?

Beyond A*

- GBFS
- 8-puzzle
- Evaluating Greedy
- Beam Search

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

Assume branching factor b and solution at depth d .

Completeness:

Time:

Space:

Admissibility:

Beam Search

- EOLQs
- Are We Done?
- Beyond A*
- GBFS
- 8-puzzle
- Evaluating Greedy
- Beam Search

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

Truncate queue to hold the most promising k nodes.
 k is the *beam width*.

Works best with breadth-first search!

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA^*
- wA^* Behavior
- Distance-to-go
- $RR-d$

Anytime Search

Real-time Search

EOLQs

Suboptimal Search

Problem Settings

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

■ Problem Settings

- wA*
- wA* Behavior
- Distance-to-go
- RR- d

Anytime Search

Real-time Search

EOLQs

optimal: minimize solution cost
suffer all with $f(n) = g(n) + h(n) < f^*$

greedy: minimize solving time

bounded suboptimal: minimize time subject to relative cost bound (factor of optimal)

bounded cost: minimize time subject to absolute cost bound

contract: minimize cost subject to absolute time bound

anytime: iteratively converge to optimal

utility: maximize given function of cost and time

Weighted A*

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings

■ wA*

- wA* Behavior
- Distance-to-go
- RR- d

Anytime Search

Real-time Search

EOLQs

$$f'(n) = g(n) + w \cdot h(n)$$

- nodes with high $h(n)$ look even worse
- no infinite rabbit holes
- suboptimality bounded: within a factor of w of optimal!

wA* Behavior

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings

- wA*

- **wA* Behavior**

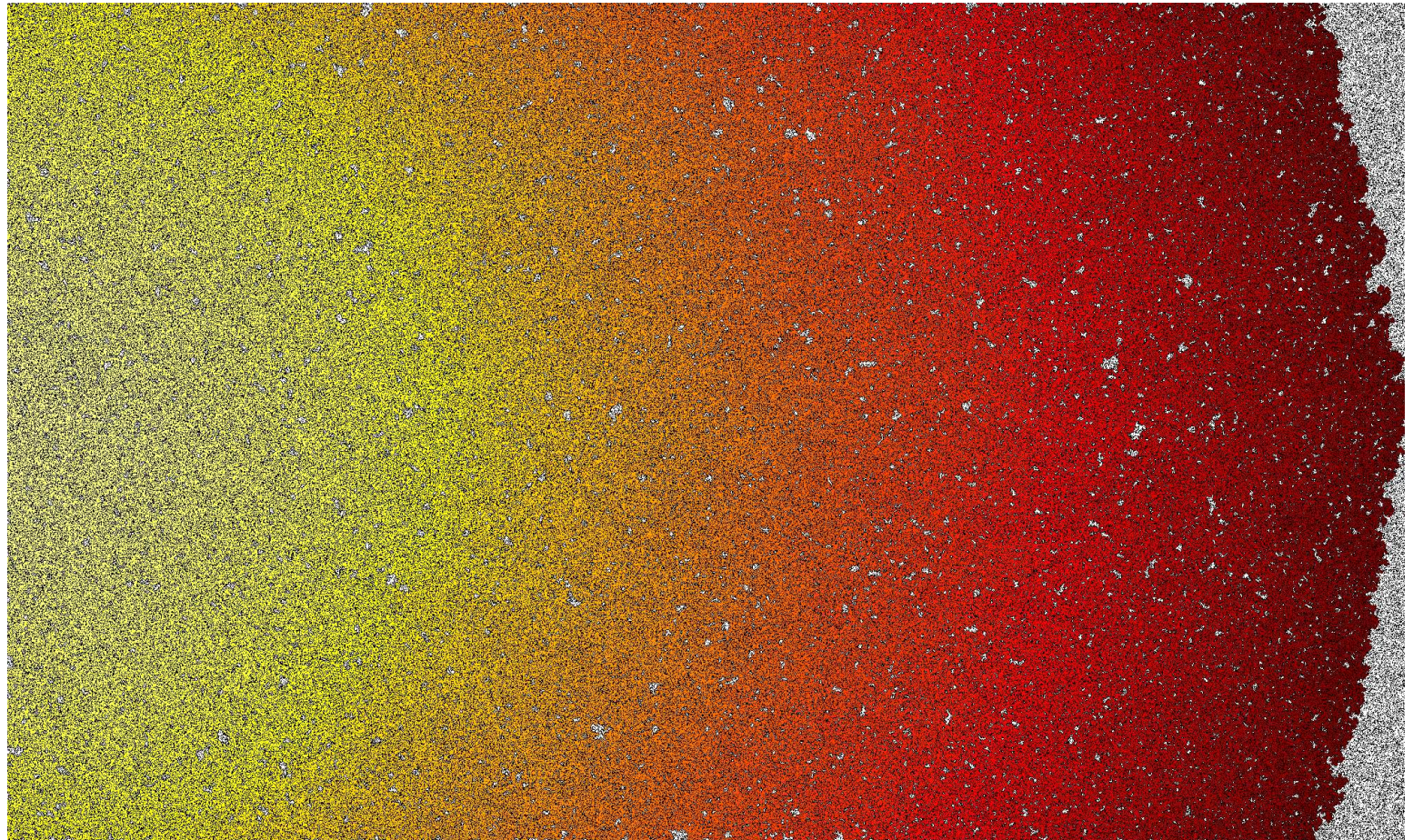
- Distance-to-go

- RR- d

Anytime Search

Real-time Search

EOLQs



optimal: uniform-cost search

wA* Behavior

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings

- wA*

■ wA* Behavior

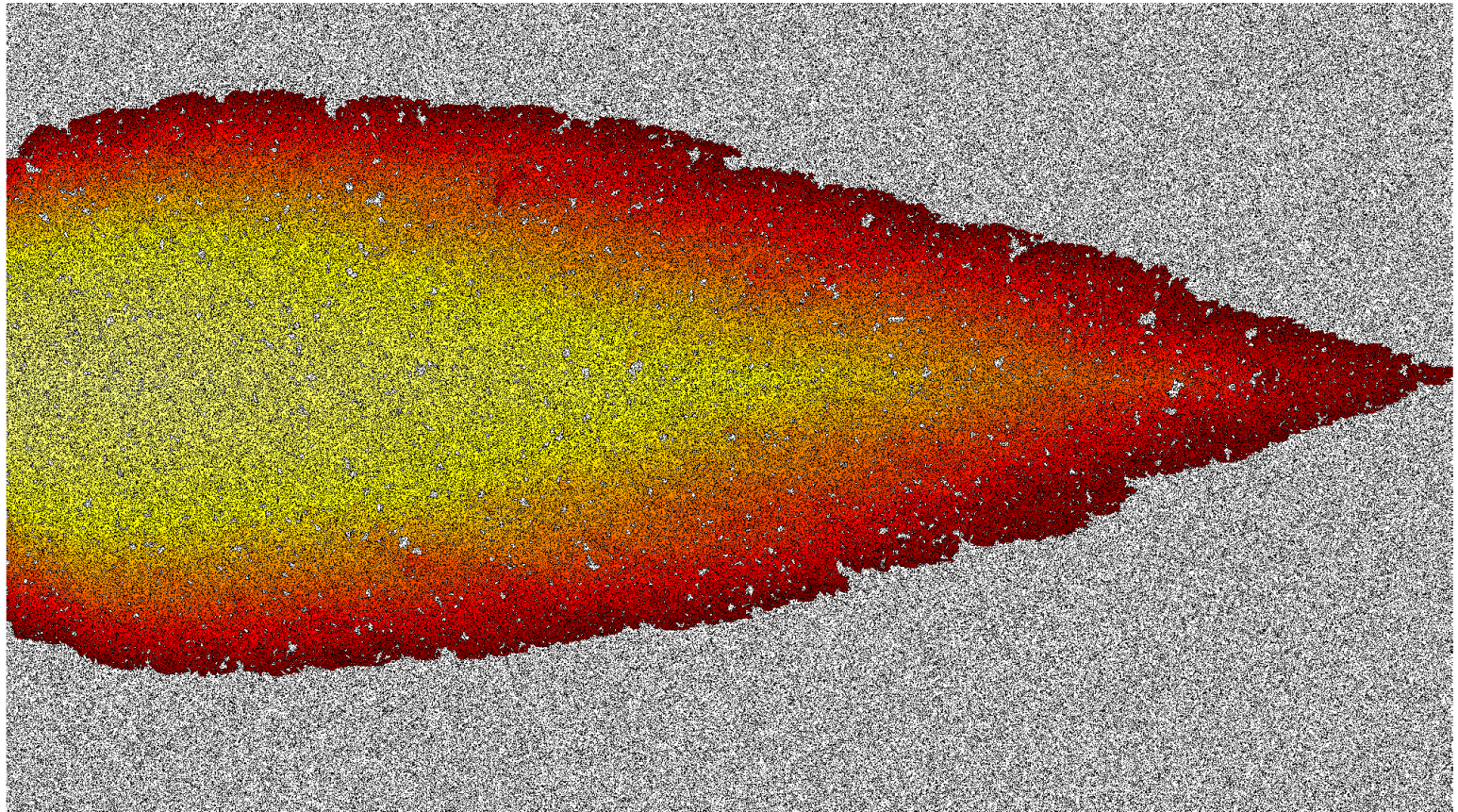
- Distance-to-go

- RR- d

Anytime Search

Real-time Search

EOLQs



optimal: A*

wA* Behavior

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings

- wA*

■ wA* Behavior

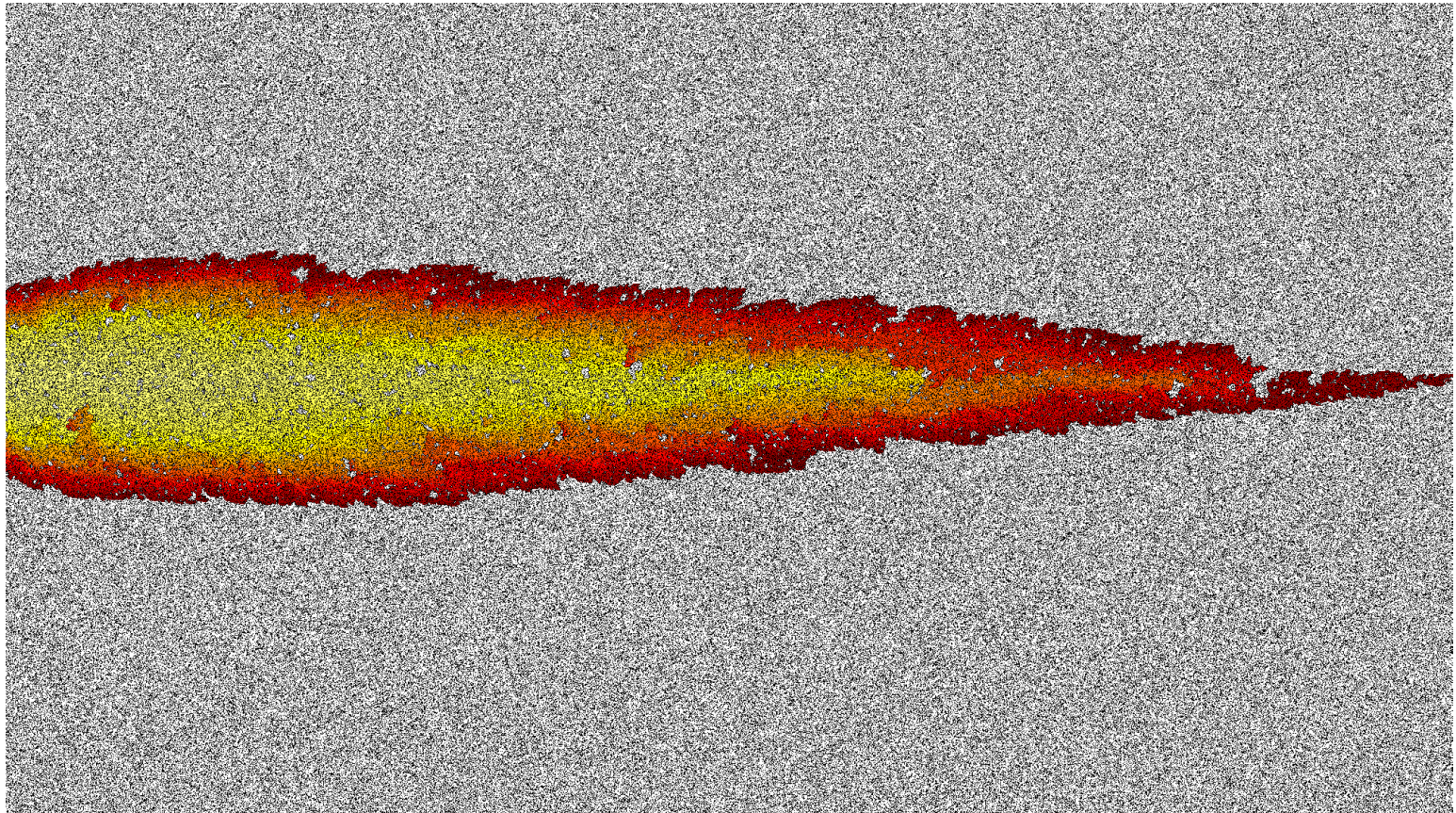
- Distance-to-go

- RR-*d*

Anytime Search

Real-time Search

EOLQs



bounded suboptimal: Weighted A*

For Speed: Distance-to-go, Not Cost-to-go

how to minimize solving time?

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go
- RR- d

Anytime Search

Real-time Search

EOLQs

For Speed: Distance-to-go, Not Cost-to-go

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go
- RR- d

Anytime Search

Real-time Search

EOLQs

how to minimize solving time?

how to minimize number of expansions?

For Speed: Distance-to-go, Not Cost-to-go

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go
- RR- d

Anytime Search

Real-time Search

EOLQs

how to minimize solving time?

how to minimize number of expansions?

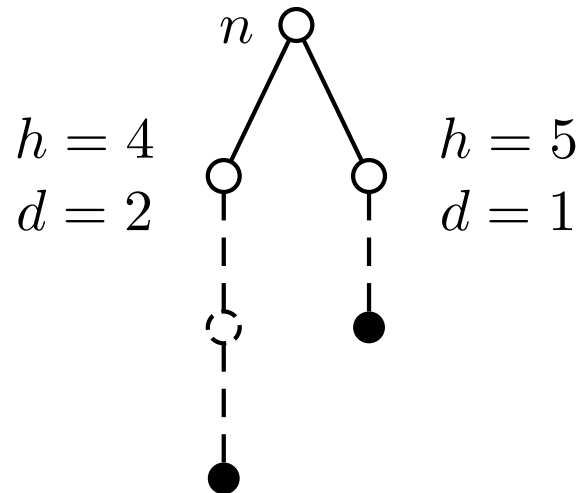
take the shortest path to a goal

For Speed: Distance-to-go, Not Cost-to-go

- EOLQs
- Are We Done?
- Beyond A*
- Suboptimal Search
- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go
- RR-d
- Anytime Search
- Real-time Search
- EOLQs

how to minimize solving time?
how to minimize number of expansions?
take the shortest path to a goal
for domains with costs, this is **not** $h(n)$

new information source: distance-to-go = $d(n)$

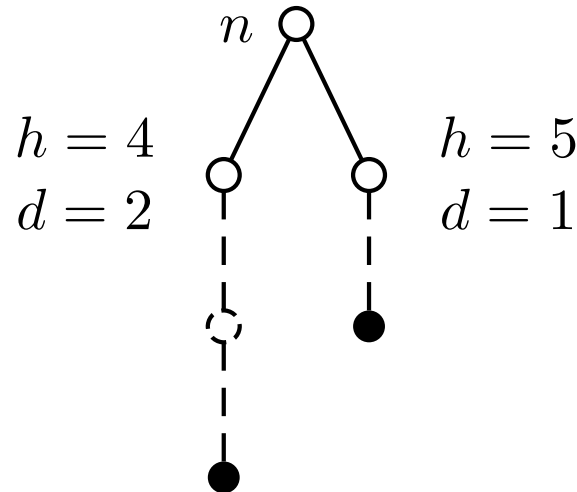


For Speed: Distance-to-go, Not Cost-to-go

- EOLQs
- Are We Done?
- Beyond A*
- Suboptimal Search
- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go
- RR- d
- Anytime Search
- Real-time Search
- EOLQs

how to minimize solving time?
how to minimize number of expansions?
take the shortest path to a goal
for domains with costs, this is **not** $h(n)$

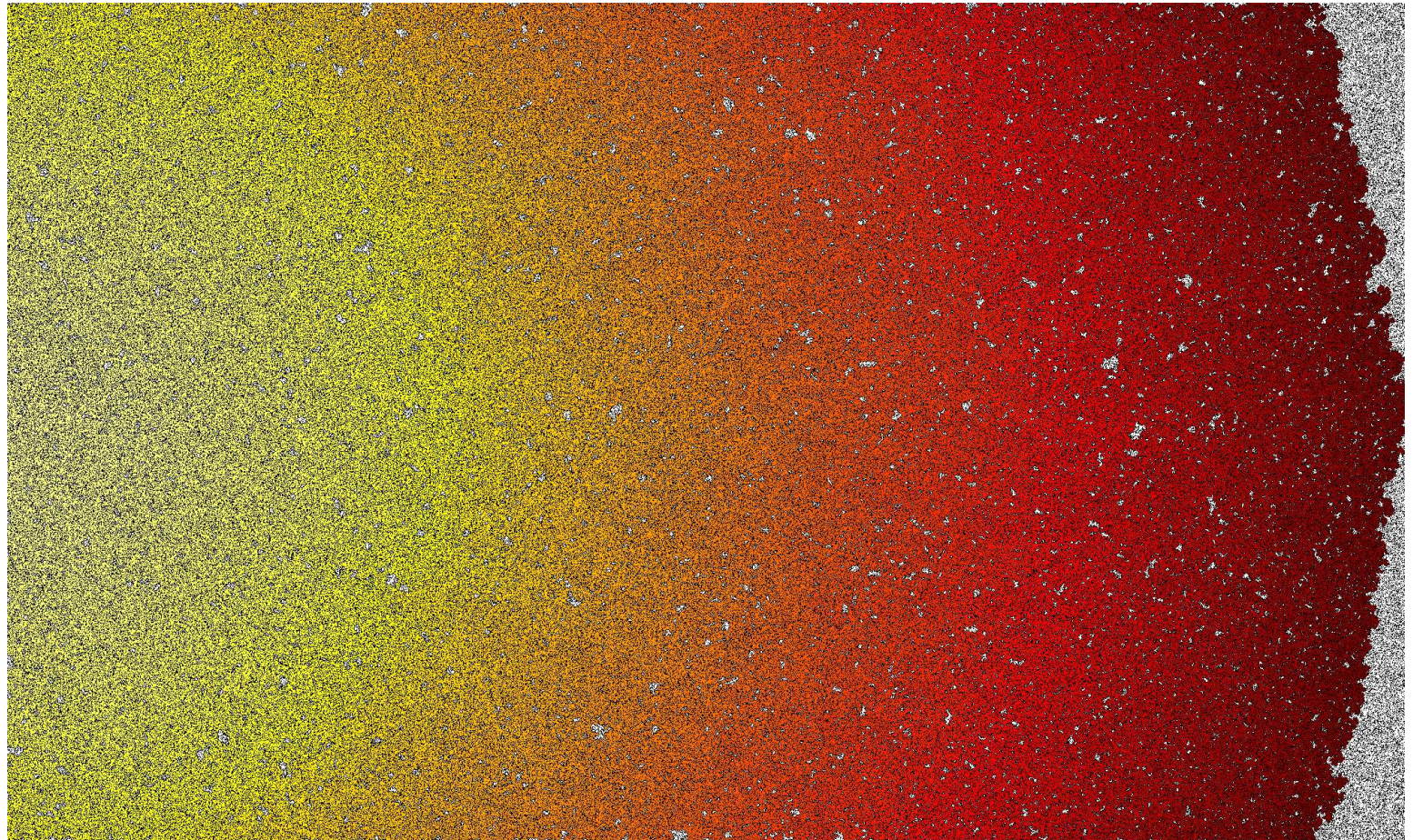
new information source: distance-to-go = $d(n)$



Speedy: best-first search on d

Round Robin d

bounded-suboptimal using h, \hat{h}, d



optimal: uniform-cost

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go

■ RR- d

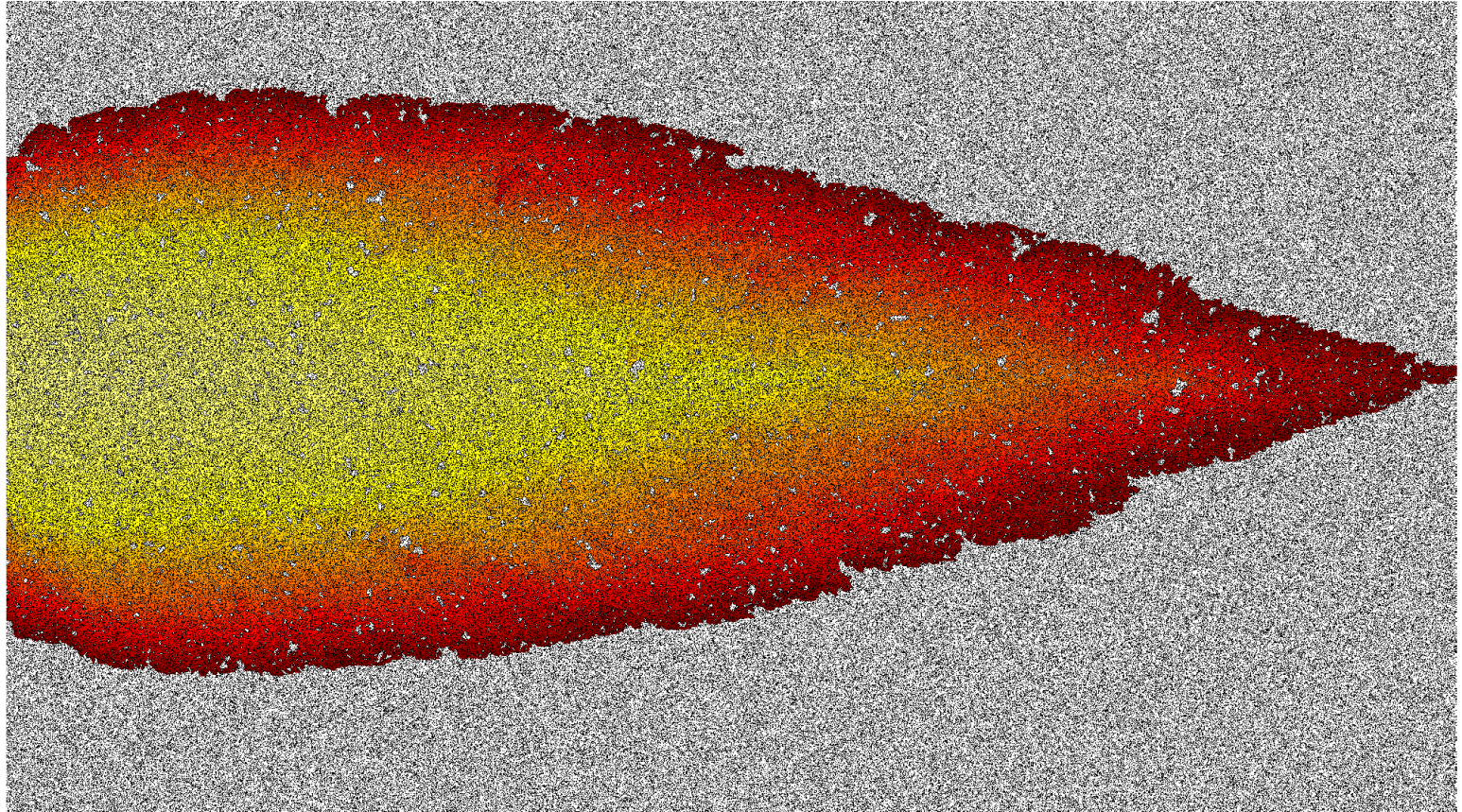
Anytime Search

Real-time Search

EOLQs

Round Robin d

bounded-suboptimal using h, \hat{h}, d



optimal: A^*

- EOLQs
- Are We Done?

Beyond A^*

Suboptimal Search

- Problem Settings
- wA^*
- wA^* Behavior
- Distance-to-go

■ **RR- d**

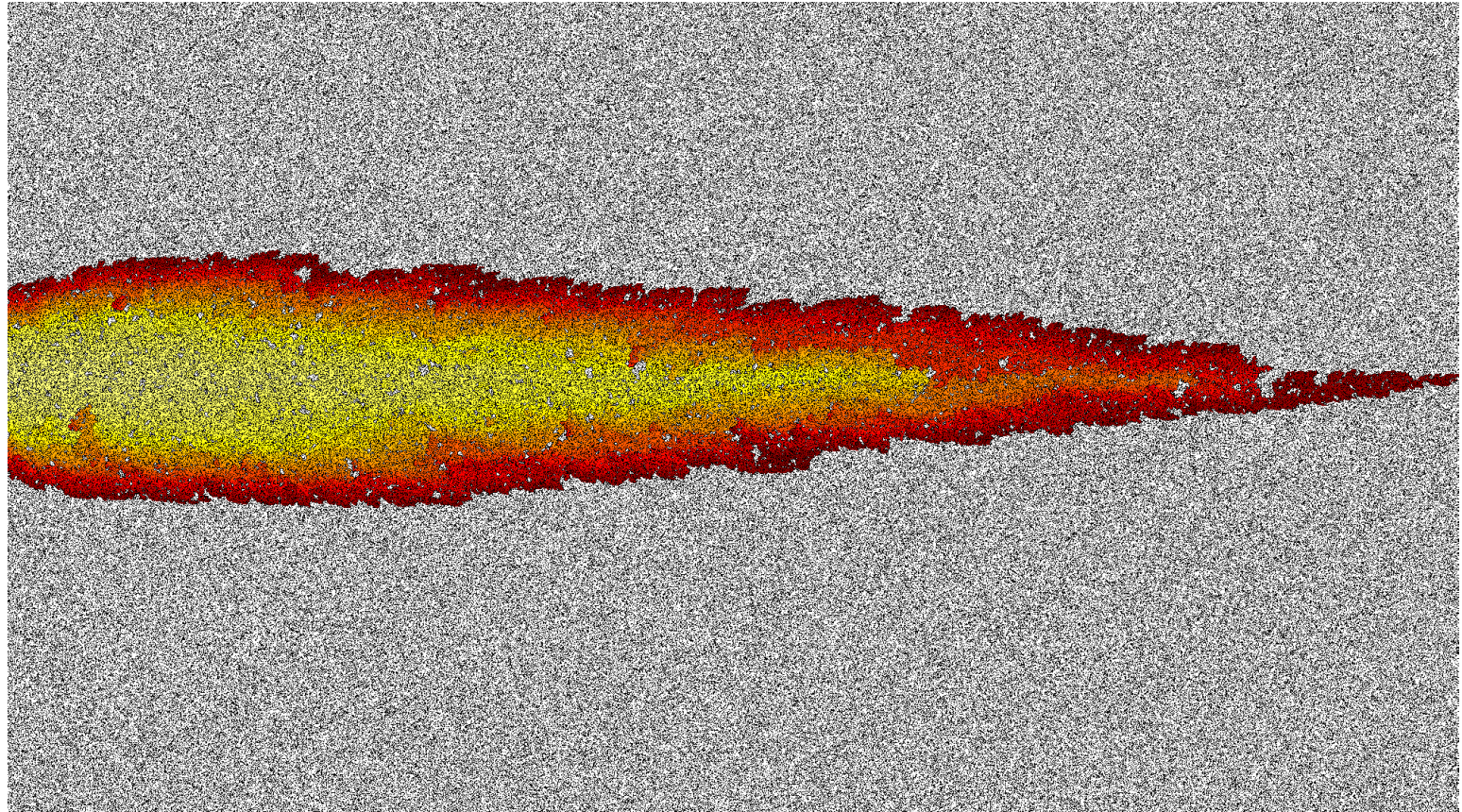
Anytime Search

Real-time Search

EOLQs

Round Robin d

bounded-suboptimal using h, \hat{h}, d



bounded suboptimal: Weighted A*

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go

■ RR- d

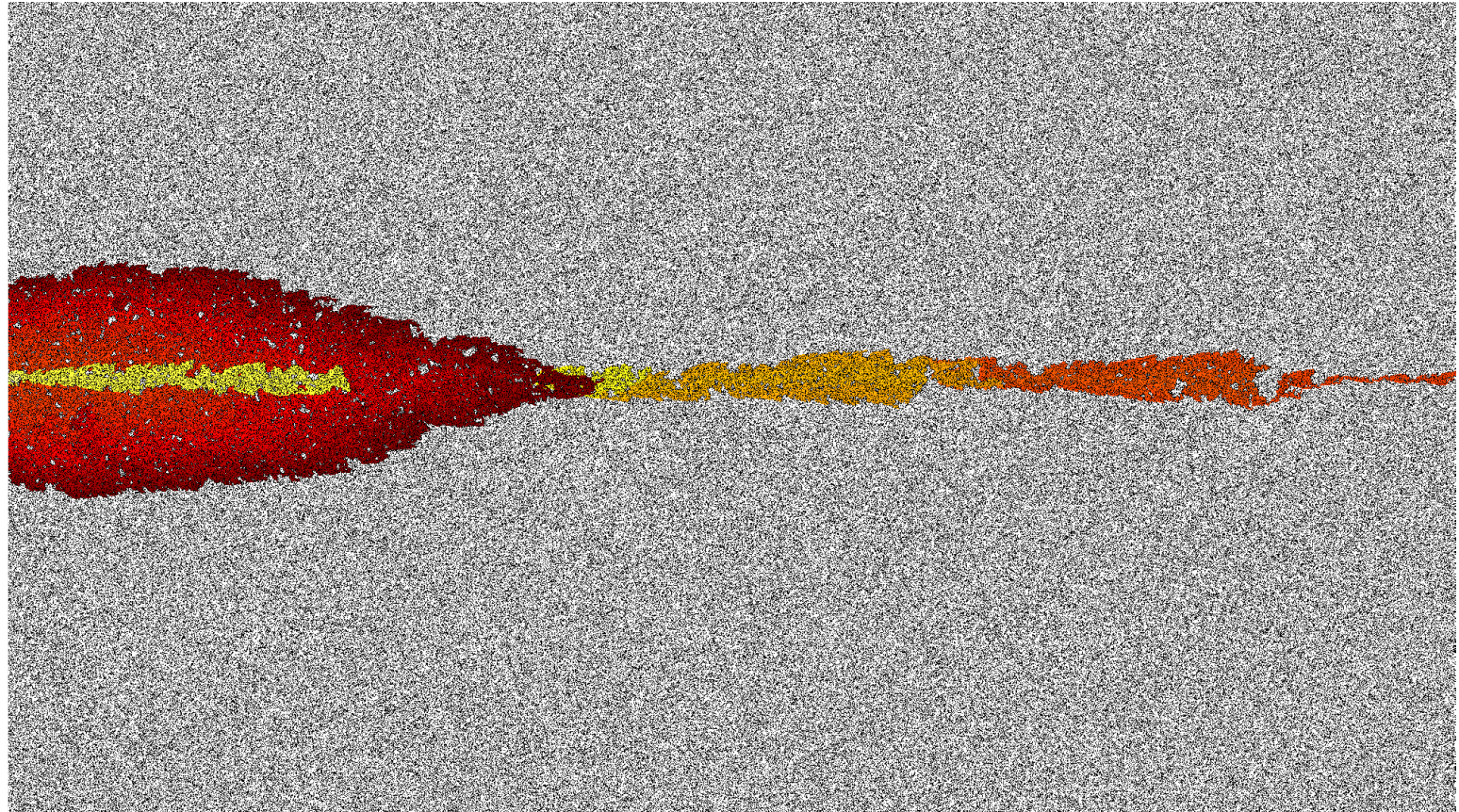
Anytime Search

Real-time Search

EOLQs

Round Robin d

bounded-suboptimal using h, \hat{h}, d



bounded suboptimal: Optimistic Search (ICAPS, 2008)

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go

■ RR- d

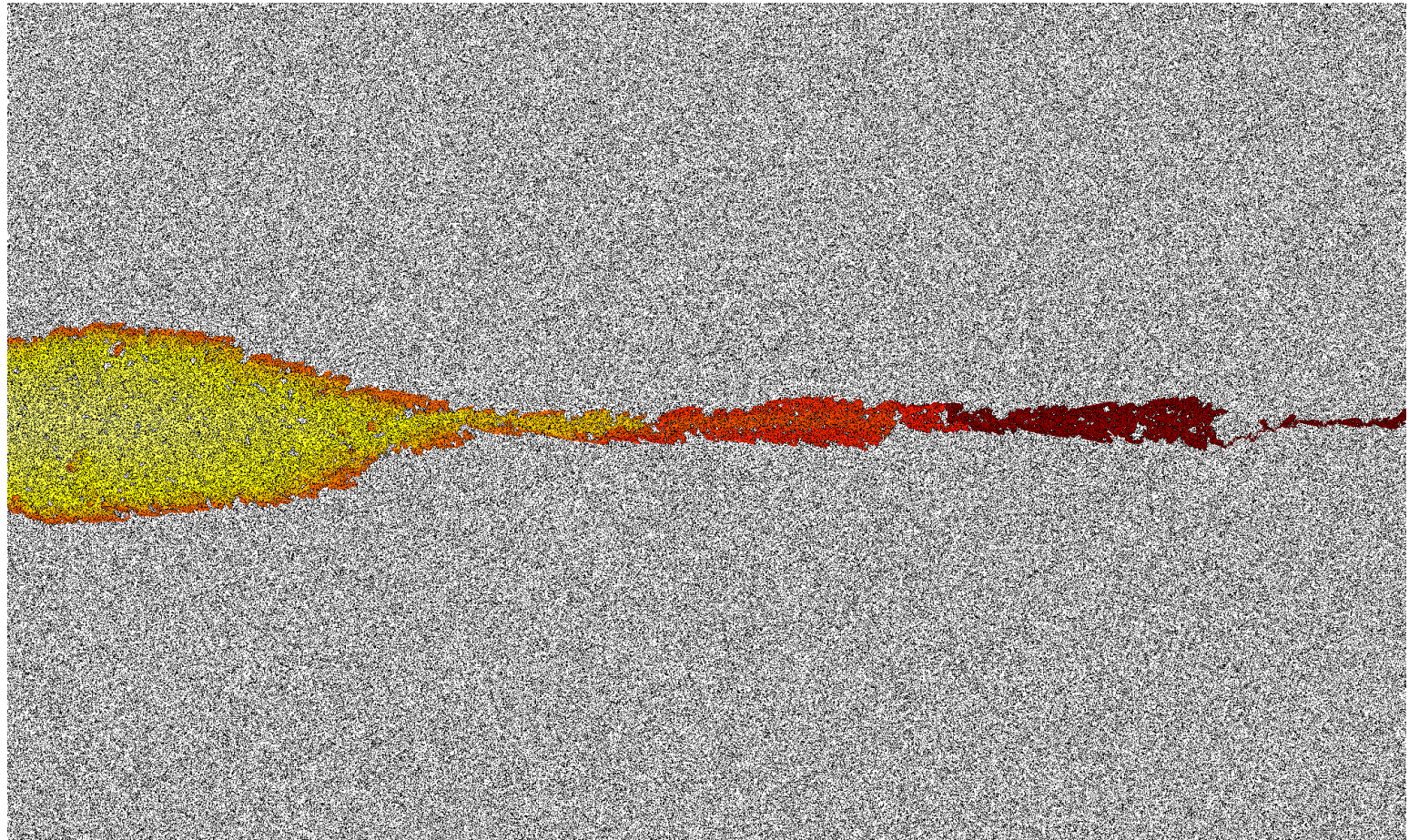
Anytime Search

Real-time Search

EOLQs

Round Robin d

bounded-suboptimal using h, \hat{h}, d



bounded suboptimal: Explicit Estimation Search (IJCAI, 2011)

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

- Problem Settings
- wA*
- wA* Behavior
- Distance-to-go

■ RR- d

Anytime Search

Real-time Search

EOLQs

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

- Anytime A*
- Break

Real-time Search

EOLQs

Anytime Search

Anytime A*

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

■ Anytime A*

■ Break

Real-time Search

EOLQs

1. run weighted A*
2. keep going after finding a goal
3. keep best goal found (can test at generation)
4. prune anything with $f(n) > incumbent$

Anytime Restarting A* (ARA*): lower weight after finding each solution

Anytime EES

Break

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

- Anytime A*

■ Break

Real-time Search

EOLQs

- asst2 (asst8), asst 3
- scores and grades

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

- RTA*
- LSS-LRTA*
- Search Algorithms
- Other Algorithms

EOLQs

Real-time Search

- EOLQs
- Are We Done?
- Beyond A*
- Suboptimal Search
- Anytime Search
- Real-time Search
- RTA*
- LSS-LRTA*
- Search Algorithms
- Other Algorithms
- EOLQs

keep hash table of h values for visited states

1. for each neighbor of current state s
2. either find h in table or do some lookahead
3. add edge cost to get f
4. update $h(s)$ to second-best f value
5. move to best neighbor

LSS-LRTA*

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

■ RTA*

■ **LSS-LRTA***

■ Search Algorithms

■ Other Algorithms

EOLQs

1. single A* lookahead (LSS)
2. update all h values in LSS
3. move to frontier

Search Algorithms

- EOLQs
- Are We Done?
- Beyond A*
- Suboptimal Search
- Anytime Search
- Real-time Search
- RTA*
- LSS-LRTA*
- **Search Algorithms**
- Other Algorithms
- EOLQs

Uninformed: DFS, UCS

Admissible: A*

Limited memory: iterative deepening (IDDFS, IDA*)

Satisficing: GBFS, Speedy, Beam

Bounded suboptimal: wA*, RR-*d*

Real-time: RTA*, LSS-LRTA*

Other Shortest-path Algorithms

- EOLQs
- Are We Done?
- Beyond A*
- Suboptimal Search
- Anytime Search
- Real-time Search
- RTA*
- LSS-LRTA*
- Search Algorithms
- **Other Algorithms**
- EOLQs

- SMA*, IE
- RBFS
- Buggy
- Rectangle Search
- any-angle pathfinding, Euclidean pathfinding
- multiobjective search
- multi-level planning: TAMP, MAPF

Course projects!

- EOLQs
- Are We Done?

Beyond A*

Suboptimal Search

Anytime Search

Real-time Search

EOLQs

- EOLQs

EOLQs

- EOLQs
- Are We Done?

[Beyond A*](#)

[Suboptimal Search](#)

[Anytime Search](#)

[Real-time Search](#)

[EOLQs](#)

■ EOLQs

Please write down the most pressing question you have about the course material covered so far and put it in the box on your way out.

Thanks!