

# **CS3243 : Introduction to Artificial Intelligence**

## Tutorial 3

NUS School of Computing

July 7, 2022

# Admin

- ▶ Consultations
- ▶ Extra material for practice

# Review

- ▶ Heuristics, more importantly on how do we come up with them
- ▶ Dominance and how it helps
- ▶ Relaxed problems, the recipe for obtaining heuristics

# Review

Admissibility	$h$ is admissible iff $\forall n : h(n) \leq h^*(n)$ An admissible heuristic will never overestimate the cost to reach the goal
Consistency	$h$ is consistent, iff for every node $n$ and every successor $n'$ of $n$ generated by action $a$ $h(n) \leq c(n, a, n') + h(n')$
Dominance	$h_1(n)$ dominates $h_2(n)$ iff $\forall n : h_1(n) \geq h_2(n)$

## Review (8-puzzle)

- ▶ Original Problem : A tile can move from square  $X$  to square  $Y$  if  $X$  is adjacent to  $Y$  and  $Y$  is blank

## Review (8-puzzle)

- ▶ Original Problem : A tile can move from square  $X$  to square  $Y$  if  $X$  is adjacent to  $Y$  and  $Y$  is blank
- ▶ Relaxed Version 1 : A tile can move from square  $X$  to square  $Y$  if  ~~$X$  is adjacent to  $Y$  and  $Y$  is blank~~

## Review (8-puzzle)

- ▶ Original Problem : A tile can move from square  $X$  to square  $Y$  if  $X$  is adjacent to  $Y$  and  $Y$  is blank
- ▶ Relaxed Version 1 : A tile can move from square  $X$  to square  $Y$  if  ~~$X$  is adjacent to  $Y$  and  $Y$  is blank~~
- ▶ Relaxed Version 2 : A tile can move from square  $X$  to square  $Y$  if  $X$  is adjacent to  $Y$  and  ~~$Y$  is blank~~

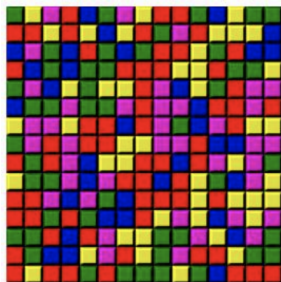
# Tutorial Question 1

- ▶ Design Admissible Heuristics for SameGame Puzzle
- ▶ Given information :
  - ▶ Initial state : Grid with  $n \times m$  tiles with  $c$  different colours
  - ▶ Neighbors : Directly adjacent tiles (Internal tiles : 4 neighbors, Edge tiles : 3 neighbors, Corner tiles : 2 neighbors)
  - ▶ Group : Set of  $\geq 2$  neighboring tiles of same color
  - ▶ Singleton : Tile not belonging to any group
  - ▶ Action/Move : Deleting a group (not singleton). Thereafter, vertical gravity and column shifting (right-to-left) applies (in transition model)
  - ▶ Goal state : Empty grid (assume solvable)
  - ▶ Transition cost : 1 (or  $\infty$  if no groups exist)



# Tutorial Question 1

- ▶ An example of the initial state :



- ▶ Top-left corner is  $(1, 1)$ ,  $1 \leq ROW \leq n$ , and  $1 \leq COL \leq m$

# Tutorial Question 1

- ▶ Idea - Admissible :  $\forall n, h(n) \leq h^*(n)$
- ▶ We have two approaches

# Tutorial Question 1

- ▶ Idea - Admissible :  $\forall n, h(n) \leq h^*(n)$
- ▶ We have two approaches
- ▶ Approach 1 : By reasoning/inference (ie What information could I use at each state to get a estimate of the number of moves needed to reach the goal? Important : Must be an underestimate!)

# Tutorial Question 1

- ▶ Idea - Admissible :  $\forall n, h(n) \leq h^*(n)$
- ▶ We have two approaches
- ▶ Approach 1 : By reasoning/inference (ie What information could I use at each state to get a estimate of the number of moves needed to reach the goal? Important : Must be an underestimate!)
- ▶ Approach 2 (better approach) : Relaxation of the game rules (ie. I now need less moves than what I originally need to reach the goal because the game has become “easier” = admissible. Important : We should be able to easily obtain the number of moves needed with the relaxed rules)

# Tutorial Question 1

- ▶ Proof of admissibility :  $h(s) = \text{Number of colours remaining.}$
- ▶ Each group contains exactly 1 colour
- ▶ Each remaining color has 1 or more groups
- ▶ Each move may reduce groups by more than 1 (example when groups of same color combine), but will never reduce remaining groups of same color below 1 (unless that color is removed by the move)
- ▶ Hence, each legal move will leave the number of colors remaining unchanged or reduce it by at most 1 if the color is removed by the move, ie.  $h(s) \leq h^*(s)$

# Tutorial Question 1

- ▶ Proof of admissibility :  $h(s) = \text{Number of colours remaining.}$
- ▶ Each group contains exactly 1 colour
- ▶ Each remaining color has 1 or more groups
- ▶ Each move may reduce groups by more than 1 (example when groups of same color combine), but will never reduce remaining groups of same color below 1 (unless that color is removed by the move)
- ▶ Hence, each legal move will leave the number of colors remaining unchanged or reduce it by at most 1 if the color is removed by the move, ie.  $h(s) \leq h^*(s)$
- ▶ Note : You may also prove admissibility by showing that heuristic was derived from a relaxed version of the game (Please refer to the forum post on LumiNUS for details)

## Tutorial Question 3

- ▶ Given information :
  - ▶ State : Position of Pac-Man in the grid at any point in time and the positions of the remaining (i.e., uneaten) pellets.
  - ▶ Initial state: Grid entirely filled with pellets except at Pac-Man's starting position.
  - ▶ Action: Move up/down/left/right.
  - ▶ Transition model: Updating the position of Pac-Man given current grid and action, and eating (ie. removing) the pellet at this new position if a pellet exists. Returns updated grid.
  - ▶ Goal state: No (uneaten) pellets left in the grid.
  - ▶ Transition/Step cost: 1 for each action taken.

## Tutorial Question 3

- ▶ Let's say admissible heuristics :  $h_1, h_3, h_4$
- ▶ On to comparing the dominance of each on another



## Tutorial Question 3

- ▶  $h_1$  vs  $h_3$
- ▶ What do you think?

## Tutorial Question 3

- ▶  $h_1$  vs  $h_3$
- ▶ What do you think?
- ▶ Let's look at the counter-examples

## Tutorial Question 3

- ▶  $h_1$  vs  $h_4$
- ▶ What do you think?

## Tutorial Question 3

- ▶  $h_1$  vs  $h_4$
- ▶ What do you think?
- ▶ Let's look at the previous counter-examples

## Tutorial Question 3

- ▶  $h_3$  vs  $h_4$
- ▶ What do you think?

## Tutorial Question 3

- ▶  $h_3$  vs  $h_4$
- ▶ What do you think?
- ▶ Average  $\leq$  Maximum, and Euclidean distance  $\leq$  Manhattan distance; hence Average Euclidean distance ( $h_4$ )  $\leq$  Maximum Manhattan distance ( $h_3$ ) for all nodes ie  $h_3$  dominates  $h_4$

## Tutorial Question 4

- ▶ Traveling Salesman Problem (TSP)
- ▶ Given a list of cities and the distances between each pair of cities, what is the shortest possible route that visits each city exactly once, and returns to the origin city?

## Tutorial Question 4

- ▶ Traveling Salesman Problem (TSP)
- ▶ Given a list of cities and the distances between each pair of cities, what is the shortest possible route that visits each city exactly once, and returns to the origin city?
- ▶ Now, this is a hard problem. We haven't been able to find a polynomial time algorithm for it. But, we have heuristics to the rescue.



## Tutorial Question 4(a)

- ▶ How can MST heuristic be derived from a relaxed version of TSP?

## Tutorial Question 4(a)

- ▶ How can MST heuristic be derived from a relaxed version of TSP?
- ▶ The TSP problem is to find a minimal length path through the cities, which forms a closed loop.
- ▶ MST is a relaxed version of the TSP problem because it only seeks for a minimal length graph that need not be a closed loop – it can be any fully-connected graph.

## Tutorial Question 4(b)

- ▶ Is the MST heuristic admissible?

## Tutorial Question 4(b)

- ▶ Is the MST heuristic admissible?
- ▶ Yes, because it is always shorter than or equal to the length of a closed loop through the cities.

## Tutorial Question 4(c)

- ▶ Hill Climbing Approach to solve TSP?

## Tutorial Question 4(c)

- ▶ Hill Climbing Approach to solve TSP?
- ▶ Algorithm:
  - ▶ Choose a random path that connects all the cities
  - ▶ Along that path, pick two cities at random
  - ▶ Partition the whole path across these two cities, which leaves us with 3 paths
  - ▶ Try all 6 possible permutations of arranging the partitions to obtain the least cost loop
  - ▶ Upon getting the best cost, repeat the steps to further improve
  - ▶ Halt when done with a certain  $k$  number of iterations

# **Thank you!**

If you have any questions, please don't hesitate. Feel free to ask!  
We are here to learn together!