## CS344: Introduction to Artificial

## Intelligence <br> (associated lab: CS386)

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Lecture-2: Introduction (salient points
repeat) $+\mathrm{A}^{*}$
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## Essential Facts

- Faculty instructor: Dr. Pushpak Bhattacharyya (www.cse.iitb.ac.in/~pb)
- TAs: Ganesh, Kushal, Janardhan and Srijith "ganesh bhosale" [ganesh.bhosale.comp@gmail.com](mailto:ganesh.bhosale.comp@gmail.com), "Kushal Ladha" [kush@cse.iitb.ac.in](mailto:kush@cse.iitb.ac.in), [janardhan@cse.iitb.ac.in](mailto:janardhan@cse.iitb.ac.in), "Srijit Dutt" [srijitdutt@cse.iitb.ac.in](mailto:srijitdutt@cse.iitb.ac.in),
- Course home page
- www.cse.iitb.ac.in/~cs344-2011
- Venue: SIC 301, KR bldg
- 1 hour lectures 3 times a week: Mon-9.30, Tue-10.30, Thu11.30 (slot 2)

AI Perspective (post-web)


## Foundational Points

- Church Turing Hypothesis
- Anything that is computable is computable by a Turing Machine
- Conversely, the set of functions computed by a Turing Machine is the set of ALL and ONLY computable functions


## Turing Machine



## Foundational Points (contd)

- Physical Symbol System Hypothesis (Newel and Simon)
- For Intelligence to emerge it is enough to manipulate symbols


## Foundational Points (contd)

- Society of Mind (Marvin Minsky)
- Intelligence emerges from the interaction of very simple information processing units
- Whole is larger than the sum of parts!


## Foundational Points (contd)

- Limits to computability
- Halting problem: It is impossible to construct a Universal Turing Machine that given any given pair $\langle M, I>$ of Turing Machine $M$ and input $I$, will decide if $M$ halts on I
- What this has to do with intelligent computation? Think!


## Foundational Points (contd)

- Limits to Automation
- Godel Theorem: A "sufficiently powerful" formal system cannot be BOTH complete and consistent
- "Sufficiently powerful": at least as powerful as to be able to capture Peano's Arithmetic
- Sets limits to automation of reasoning


## Foundational Points (contd)

- Limits in terms of time and Space
- NP-complete and NP-hard problems: Time for computation becomes extremely large as the length of input increases
- PSPACE complete: Space requirement becomes extremely large
- Sets limits in terms of resources


# Two broad divisions of Theoretical CS 

- Theory A
- Algorithms and Complexity
- Theory B
- Formal Systems and Logic


## AI as the forcing function

- Time sharing system in OS
- Machine giving the illusion of attending simultaneously with several people
- Compilers
- Raising the level of the machine for better man machine interface
- Arose from Natural Language Processing (NLP)
- NLP in turn called the forcing function for AI


## Goal of Teaching the course

- Concept building: firm grip on foundations, clear ideas
- Coverage: grasp of good amount of material, advances
- Inspiration: get the spirit of AI, motivation to take up further work


## Resources

- Main Text:
- Artificial Intelligence: A Modern Approach by Russell \& Norvik, Pearson, 2003.
- Other Main References:
- Principles of AI - Nilsson
- AI - Rich \& Knight
- Knowledge Based Systems - Mark Stefik
- Journals
- AI, AI Magazine, IEEE Expert,
- Area Specific Journals e.g, Computational Linguistics
- Conferences
- IJCAI, AAAI

Positively attend lectures!

## Grading

- Midsem
- Endsem
- Group wise assignments (closely follows lectures)
- Paper reading (possibly seminar)
- Quizzes


## Search: Everywhere

## Planning

- (a) which block to pick, (b) which to stack, (c) which to unstack, (d) whether to stack a block or (e) whether to unstack an already stacked block. These options have to be searched in order to arrive at the right sequence of actions.



## Vision

- A search needs to be carried out to find which point in the image of $L$ corresponds to which point in $R$. Naively carried out, this can become an $O(n 2)$ process where $n$ is the number of points in the retinal images.



## Robot Path Planning

- searching amongst the options of moving Left, Right, Up or Down. Additionally, each movement has an associated cost representing the relative difficulty of each movement. The search then will have to find the optimal, i.e., the least cost path.


Robot
Path

## Natural Language Processing

- search among many combinations of parts of speech on the way to deciphering the meaning. This applies to every level of processingsyntax, semantics, pragmatics and discourse.



## Expert Systems

## Search among rules, many of which can apply to a situation:

If-conditions
the infection is primary-bacteremia
AND the site of the culture is one of the sterile sites
AND the suspected portal of entry is the gastrointestinal tract
THEN
there is suggestive evidence (0.7) that infection is bacteroid
(from MYCIN)

## Search building blocks

- State Space : Graph of states (Express constraints and parameters of the problem)
- Operators : Transformations applied to the states.
- Start state : $S_{0}$ (Search starts from here)
> Goal state : $\{G\}$ - Search terminates here.
, Cost : Effort involved in using an operator.
- Optimal path : Least cost path


## Examples

## Problem 1:8-puzzle

| 4 | 3 | 6 |
| :---: | :---: | :---: |
| 2 | 1 | 8 |
| 7 |  | 5 |

S


G

Tile movement represented as the movement of the blank space.
Operators:
L: Blank moves left
R : Blank moves right
U : Blank moves up
D : Blank moves down

$$
C(L)=C(R)=C(U)=C(D)=1
$$

## Problem 2: Missionaries and Cannibals



Constraints

- The boat can carry at most 2 people
- On no bank should the cannibals outnumber the missionaries

State : <\#M, \#C, P>
$\# M=$ Number of missionaries on bank $L$
$\# C=$ Number of cannibals on bank $L$
$P=$ Position of the boat
$S 0=\langle 3,3, L\rangle$
$G=\langle 0,0, R\rangle$

Operations
$M 2$ = Two missionaries take boat
$M 1=$ One missionary takes boat
$C 2=$ Two cannibals take boat
$C 1=$ One cannibal takes boat
$\mathrm{MC}=$ One missionary and one cannibal takes boat


Partial search tree

## Problem 3

| $B$ | $B$ | $B$ | $W$ | $W$ | $W$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |

$G$ : States where no $\mathbf{B}$ is to the left of any $\mathbf{W}$ Operators:

1) A tile jumps over another tile into a blank tile with cost

2
2) A tile translates into a blank space with cost 1

## Algorithmics of Search

## General Graph search Algorithm



Graph $G=(\mathrm{V}, \mathrm{E})$

1) Open List: $S^{(\varnothing, 0)}$

Closed list : $\varnothing$
2) $\mathrm{OL}: \mathrm{A}^{(\mathrm{S}, 1)}, \mathrm{B}^{(\mathrm{S}, 3)}, \mathrm{C}^{(\mathrm{S}, 10)}$ CL: S
3) $\mathrm{OL}: \mathrm{B}^{(\mathrm{S}, 3)}, \mathrm{C}^{(\mathrm{S}, 10)}, \mathrm{D}^{(\mathrm{A}, 6)}$ CL: S, A
4) OL: $C^{(S, 10)}, D^{(A, 6)}, E^{(B, 7)}$

CL: S, A, B
5) $\mathrm{OL}: \mathrm{D}^{(\mathrm{A}, 6)}, \mathrm{E}^{(\mathrm{B}, 7)}$

CL: S, A, B , C
6) $\mathrm{OL}: \mathrm{E}^{(\mathrm{B}, 7)}, \mathrm{F}^{(\mathrm{D}, 8)}, \mathrm{G}^{(\mathrm{D}, 9)}$ CL: S, A, B, C, D
7) $O L: F^{(\mathrm{D}, 8)}, \mathrm{G}^{(\mathrm{D}, 9)}$ CL:S, A, B, C, D, E
8) OL: $G^{(D, 9)}$

CL: S, A, B, C, D, E, F
9) OL : $\emptyset$

CL: S, A, B, C, D, E, F, G

## Steps of GGS <br> (principles of AI, Nilsson,)

- 1. Create a search graph $G$, consisting solely of the start node $S$; put $S$ on a list called $O P E N$.
- 2. Create a list called CLOSED that is initially empty.
- 3. Loop: if OPEN is empty, exit with failure.
- 4. Select the first node on OPEN, remove from OPEN and put on CLOSED, call this node $n$.
- 5 . if $n$ is the goal node, exit with the solution obtained by tracing a path along the pointers from $n$ to $s$ in $G$. (ointers are established in step 7).
- 6 . Expand node $n$, generating the set $M$ of its successors that are not ancestors of $n$. Install these memes of $M$ as successors of $n$ in $G$.


## GGS steps (contd.)

- 7. Establish a pointer to $n$ from those members of $M$ that were not already in $G$ (i.e., not already on either OPEN or CLOSED). Add these members of $M$ to OPEN. For each member of $M$ that was already on OPEN or CLOSED, decide whether or not to redirect its pointer to $n$. For each member of $M$ already on CLOSED, decide for each of its descendents in $G$ whether or not to redirect its pointer.
- 8. Reorder the list OPEN using some strategy.
- 9. Go LOOP.


## GGS is a general umbrella



## Algorithm A

- A function $f$ is maintained with each node $f(n)=g(n)+h(n), n$ is the node in the open list
- Node chosen for expansion is the one with least $f$ value
- For BFS: $h=0, g=$ number of edges in the path to $S$
- For DFS: $h=0, g=\frac{1}{\text { No of edges in the path to } S}$


## Algorithm A*

- One of the most important advances in AI
- $g(n)=$ least cost path to n from S found so far
- $h(n)<=h^{*}(n)$ where $h^{*}(n)$ is the actual cost of optimal path to G (node to be found) from $n$ "Optimism leads to optimality"



## A*: Definitions and Properties

## A* Algorithm - Definition and Properties

- $f(n)=g(n)+h(n)$
- The node with the least value of $f$ is chosen from the OL.
- $\begin{aligned} & f^{*}(n)=g^{*}(n)+h^{*}(n) \text {, } \\ & \text { where, }\end{aligned}$ $g^{*}(n)=$ actual cost of the optimal path ( $s, n$ )
$h^{*}(n)=$ actual cost of optimal path $(n, g)$
- $g(n) \geq g^{*}(n)$
- By definition, $h(n) \leq h^{*}(n)$



## 8-puzzle: heuristics

Example: 8 puzzle

| 2 | 1 | 4 |
| :--- | :--- | :--- |
| 7 | 8 | 3 |
| 5 | 6 |  |

$S$

| 1 | 6 | 7 |
| :--- | :--- | :--- |
| 4 | 3 | 2 |
| 5 |  | 8 |

$n$

| 1 | 2 | 3 |  |
| :--- | :--- | :--- | :---: |
| 4 | 5 | 6 |  |
| 7 | 8 |  |  |
| 9 |  |  |  |

$h^{*}(n)=$ actual no. of moves to transform $n$ to $g$

1. $h_{1}(n)=$ no. of tiles displaced from their destined position.
2. $h_{2}(n)=$ sum of Manhattan distances of tiles from their destined position.
$h_{1}(n) \leq h^{*}(n)$ and $h_{1}(n) \leq h^{*}(n)$


Comparison

## A* Algorithm- Properties

- Admissibility: An algorithm is called admissible if it always terminates and terminates in optimal path
- Theorem: A* is admissible.
- Lemma: Any time before $A^{*}$ terminates there exists on $O L$ a node $n$ such that $f(n)<=f^{*}(s)$
- Observation: For optimal path $s \rightarrow n_{1} \rightarrow n_{2} \rightarrow \ldots \rightarrow$ g,

1. $h^{*}(g)=0, g^{*}(s)=0$ and
2. $f^{*}(s)=f^{*}\left(n_{1}\right)=f^{*}\left(n_{2}\right)=f^{*}\left(n_{3}\right) \ldots=f^{*}(g)$

## A* Properties (contd.)

$f^{*}\left(n_{i}\right)=f^{*}(s), \quad n_{i} \neq s$ and $n_{i} \neq g$
Following set of equations show the above equality:

$$
\begin{aligned}
& f^{*}\left(n_{i}\right)=g^{*}\left(n_{i}\right)+h^{*}\left(n_{j}\right) \\
& f^{*}\left(n_{i+1}\right)=g^{*}\left(n_{i+1}\right)+h^{*}\left(n_{i+1}\right) \\
& g^{*}\left(n_{i+1}\right)=g^{*}\left(n_{i}\right)+c\left(n_{i}, n_{i+1}\right) \\
& h^{*}\left(n_{i+1}\right)=h^{*}\left(n_{i}\right)-c\left(n_{i}, n_{i+1}\right)
\end{aligned}
$$

Above equations hold since the path is optimal.

## Admissibility of A*

A* always terminates finding an optimal path to the goal if such a path exists.

Intuition

(1) In the open list there always exists a node $n$ such that $f(n)<=f^{*}(S)$.
(2) If A* does not terminate, the $f$ value of the nodes expanded become unbounded.

1) and 2) are together inconsistent

Hence A* must terminate

## Lemma

Any time before $\mathrm{A}^{*}$ terminates there exists in the open list a node $n^{\prime}$ such that $f\left(n^{\prime}\right)<=f^{*}(S)$


For any node $n_{i}$ on optimal path,
$f\left(n_{i}\right)=g\left(n_{i}\right)+h\left(n_{i}\right)$
$<=g^{*}\left(n_{i}\right)+h^{*}\left(n_{i}\right)$
Also $f^{*}\left(n_{i}\right)=f^{*}(S)$
Let $n$ ' be the first node in the optimal path that is in OL. Since all parents of $n^{\prime}$ have gone to CL,

$$
\begin{aligned}
& g\left(n^{\prime}\right)=g^{*}\left(n^{\prime}\right) \text { and } h\left(n^{\prime}\right)<=h^{*}\left(n^{\prime}\right) \\
& =>f\left(n^{\prime}\right)<=f^{*}(S)
\end{aligned}
$$

## If A* does not terminate

Let $e$ be the least cost of all arcs in the search graph.
Then $g(n)>=e . l(n)$ where $l(n)=\#$ of arcs in the path from $S$ to $n$ found so far. If A* does not terminate, $g(n)$ and hence $f(n)=g(n)+h(n)[h(n)>=0]$ will become unbounded.

This is not consistent with the lemma. So A* has to terminate.

## $2^{\text {nd }}$ part of admissibility of $A^{*}$

The path formed by A* is optimal when it has terminated

## Proof

Suppose the path formed is not optimal
Let $G$ be expanded in a non-optimal path.
At the point of expansion of $G$,

$$
\begin{aligned}
& f(G)=g(G)+h(G) \\
& =g(G)+0 \\
& >g^{*}(G)=g^{*}(S)+h^{*}(S) \\
& \quad=f^{*}(S)\left[f^{*}(S)=\text { cost of optimal path }\right]
\end{aligned}
$$

This is a contradiction
So path should be optimal

