

# Video Lectures On Artificial Intelligence

## Lecture 09 Z

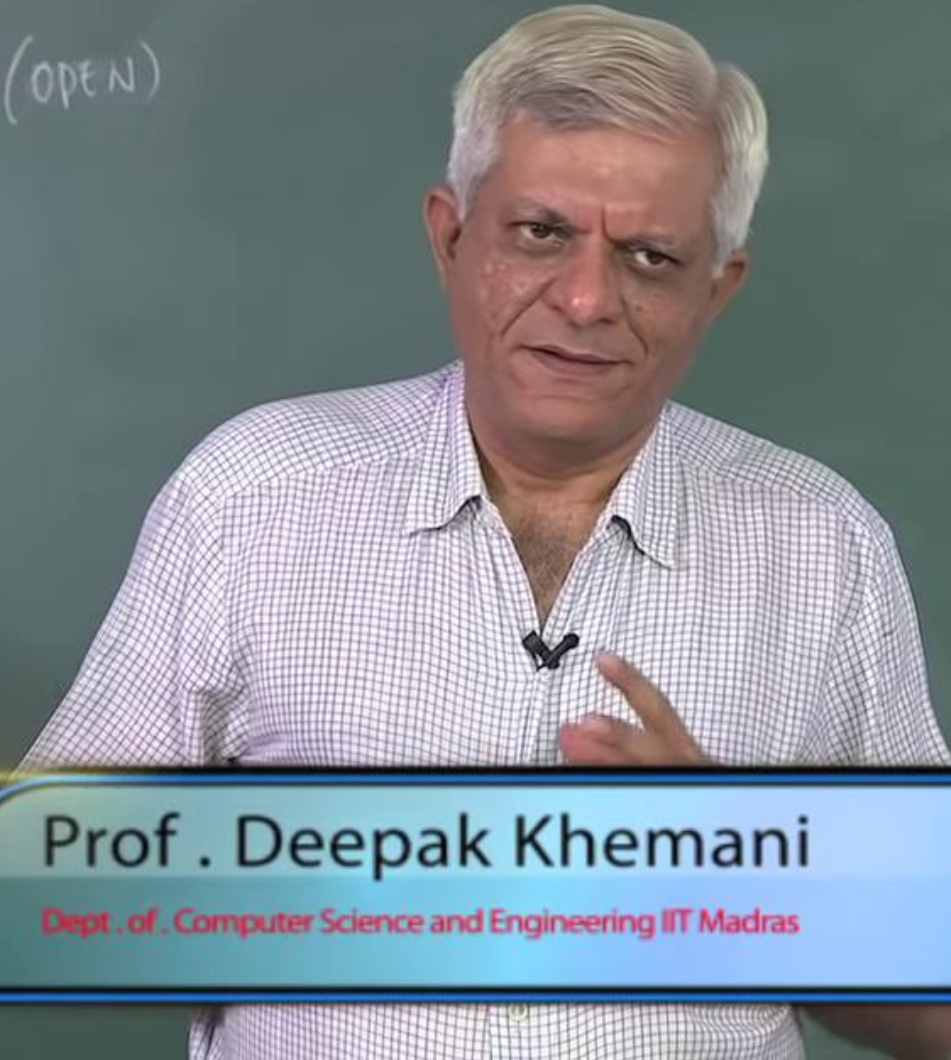
**Prof. Deepak Khemani**

Department of Computer Science and Engineering  
IIT Madras



$\leftarrow (Start, NIL)$   
OPEN not empty  
NodePair  $\leftarrow$  Head(OPEN)

State Space Search



Prof . Deepak Khemani

Dept . of . Computer Science and Engineering IIT Madras



Rubik's cube

$$b = 18$$

$$18^{10} \approx 3.5 \times 10^{12}$$

$$(10^{20}) \approx 127 \times 10^{25}$$

Billion  
Centuries

$10^{19}$  seconds

$10^{17}$  min

$10^{15}$  hours

$10^{13}$

15-puzzle -  $10^{13}$

24-puzzle -  $10^{24}$

Rubik's cube

$b = 18$

$10 \approx 35 \times 10^{12}$

$(10) \approx 127 \times 10^{25}$

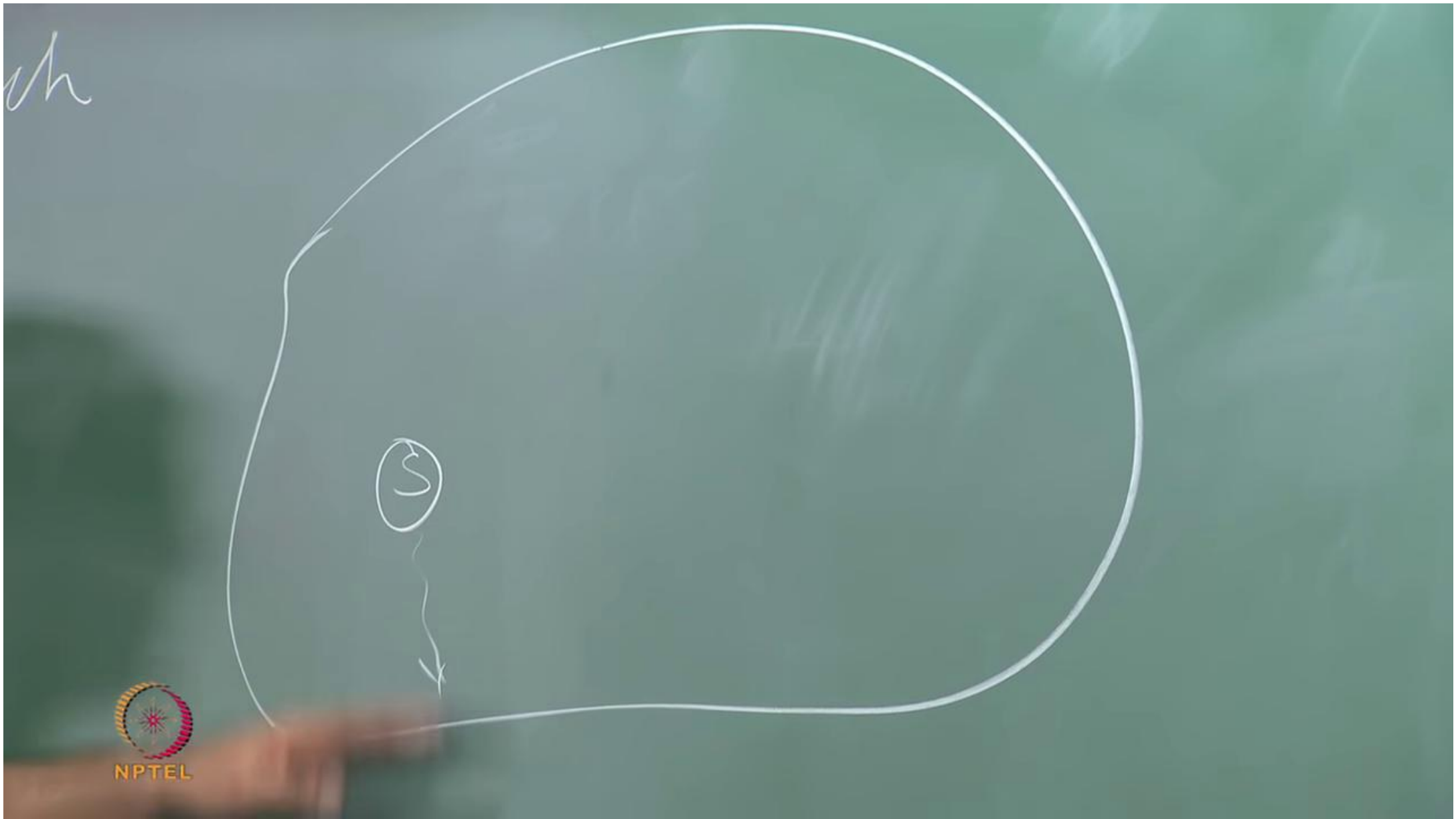
$10^{19}$  seconds

$10^{13}$  min

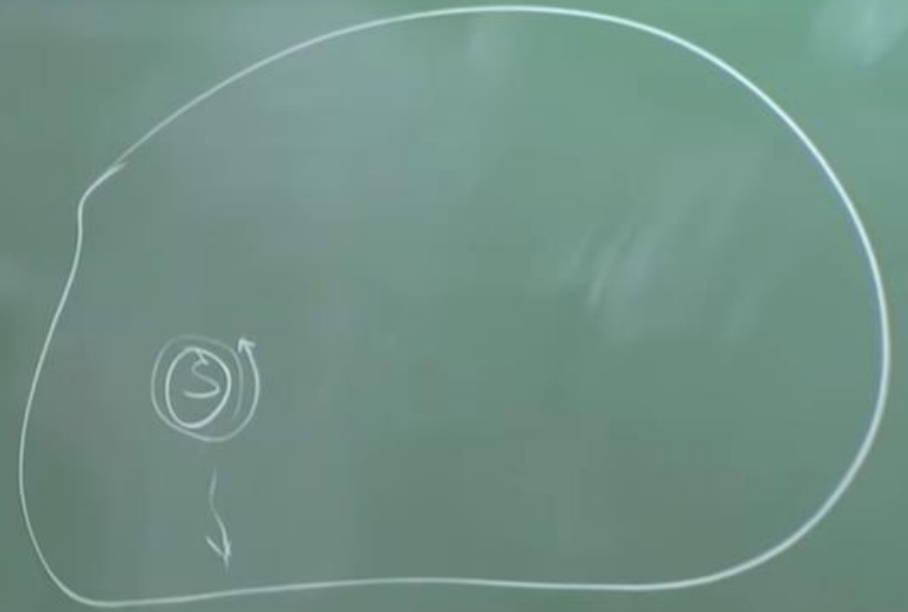
$10^{15}$  hours

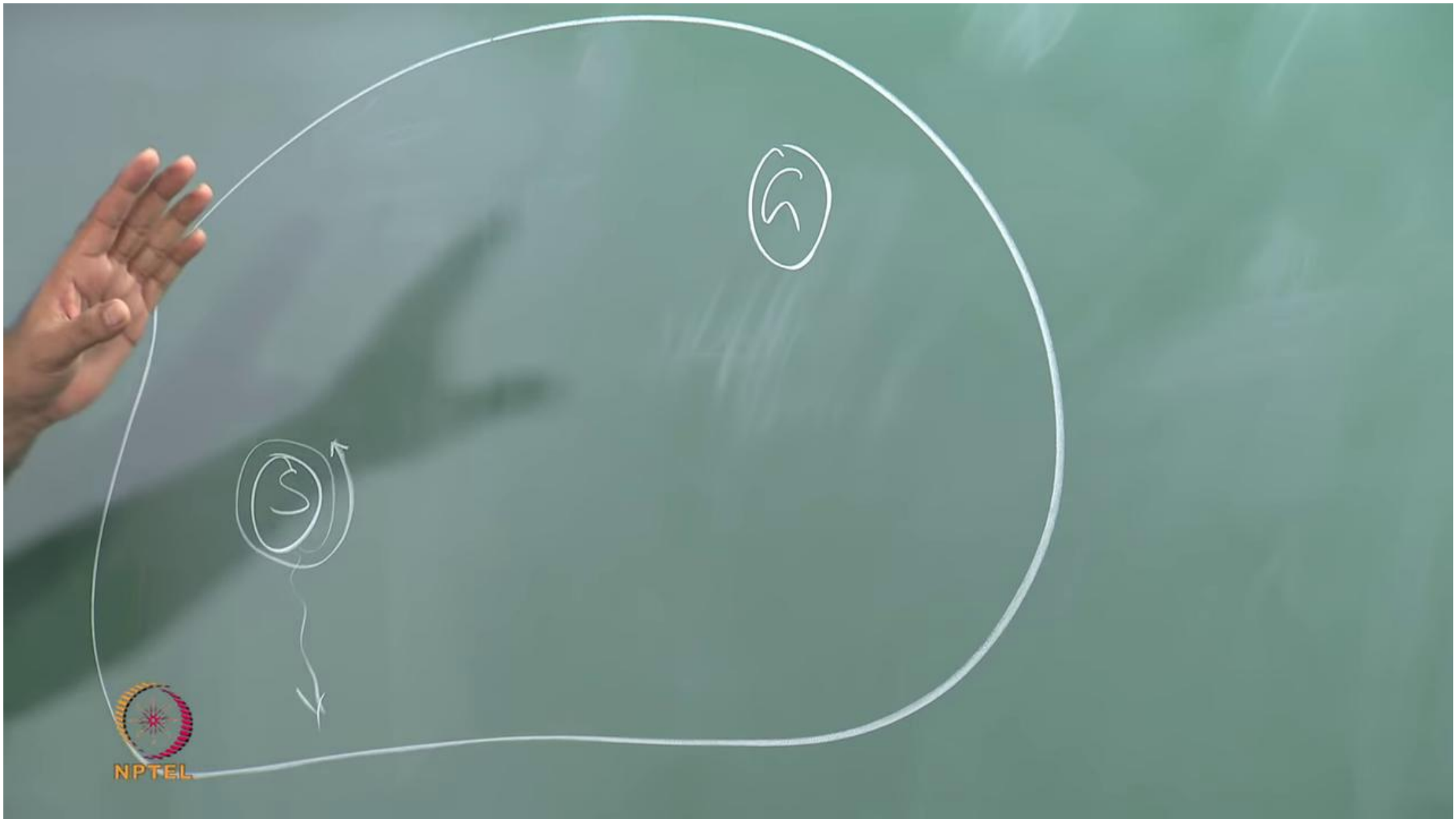
$10^{12}$  days





# State Space Search





tant, NIL)  
st empty  
 $\leftarrow \text{Head}(\text{OPEN})$

# State Space Search HEURISTIC Search





# HEURISTIC Search

# HEURISTIC Search

Heurisko

Heuriskenn



# HEURISTIC Search

Eureka  
Eureka  
Heurisko  
Heuriskenn



Some other words

# HEURISTIC Search

$h(n)$  ←

Eureka  
Eureka  
Heureka  
Heureka



$OPEN \leftarrow ((Start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

$h(n) \leftarrow$



$OPEN \leftarrow ((start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

⋮  
New

$OPEN \leftarrow Sort_h(Append(New\ Tail(OPEN)))$

HEURISTIC  
 $h(n) \leftarrow$   
Eureka



$OPEN \leftarrow ((start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

...

New

$OPEN \leftarrow Sort_h(Append(New\ Tail(OPEN)))$

HEURIST  
 $h(n) \leftarrow$   
Eureka



NPTEL

$OPEN \leftarrow ((start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

⋮  
New

$OPEN \leftarrow Sort_h(Append(New Tail(OPEN)))$

HEURIST  
 $h(n) \leftarrow$   
Eureka



NPTEL

$OPEN \leftarrow ((Start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

heuristic function HEURISTI

$h(n)$

Eureka

New

$OPEN \leftarrow Sort_h(Append(New\ Tail(OPEN)))$



NPTEL

$OPEN \leftarrow ((Start, NIL))$   
While  $OPEN$  not empty  
     $NodePair \leftarrow Head(OPEN)$

heuristic function  $h(n)$  HEURISTIC

Eureka  
Eureka  
Heur

New

$OPEN \leftarrow Sort_h(Append(New, Tail(OPEN)))$   
Merge( $Sort(New)$ ,  $Tail(OPEN)$ )





OPEN  $\leftarrow$  ((Start, NIL))  
While OPEN not empty  
NodePair  $\leftarrow$  Head(OPEN)

downward function  
 $h(n) \leftarrow$

Eureka

New

OPEN  $\leftarrow$  Sort<sub>k</sub>(Append(New Tail(OPEN)))  
Merge(sort<sub>k</sub>(New), Tail(OPEN))

New

$OPEN \leftarrow \text{Sort}_h(\text{Append}(\text{New Tail}(OPEN)))$

Priority Queue

$\text{Merge}(\text{Sort}_h(\text{New}), \text{Tail}(OPEN))$

While OPEN not empty  
NodePair  $\leftarrow$  Head(OPEN)

downward function HEURI  
 $h(n) \leftarrow$

Eureka

New

OPEN  $\leftarrow$  Sort<sub>h</sub>(Append(New Tail(OPEN)))

Merge (Sort(New), Tail(OPEN))

Queue



While OPEN not empty  
NodePair  $\leftarrow$  Head(OPEN)

heuristic function HEUR  
 $h(n) \leftarrow$

Eureka

New

OPEN  $\leftarrow$  Sort<sub>h</sub>(Append(New Tail(OPEN)))

Priority Queue

Merge (sort(New), Tail(OPEN))





New

$OPEN \leftarrow \text{Sort}_h(\text{Append}(\text{New Tail}(OPEN)))$

Priority Queue

$\text{Merge}(\text{Sort}_h(\text{New}), \text{Tail}(OPEN))$





# Search Node



$(\text{current}, \text{Parent}, h)$



NPTEL

While OPEN not empty  
NodePair  $\leftarrow$  Head(OPEN)

Search Node

$n = (\text{Current}, \text{Parent}, h)$  New

Computed  
when  $n$  is  
generated

OPEN  $\leftarrow$  Sort <sub>$h$</sub> (Append(New To  
Merge(sort(New  
Priority Queue



heuristic function HEURISTIC Search

$h(n)$

Domain Dependent  
(Static)



NPTEL

(Heuristic (DPEN))

Search

ent

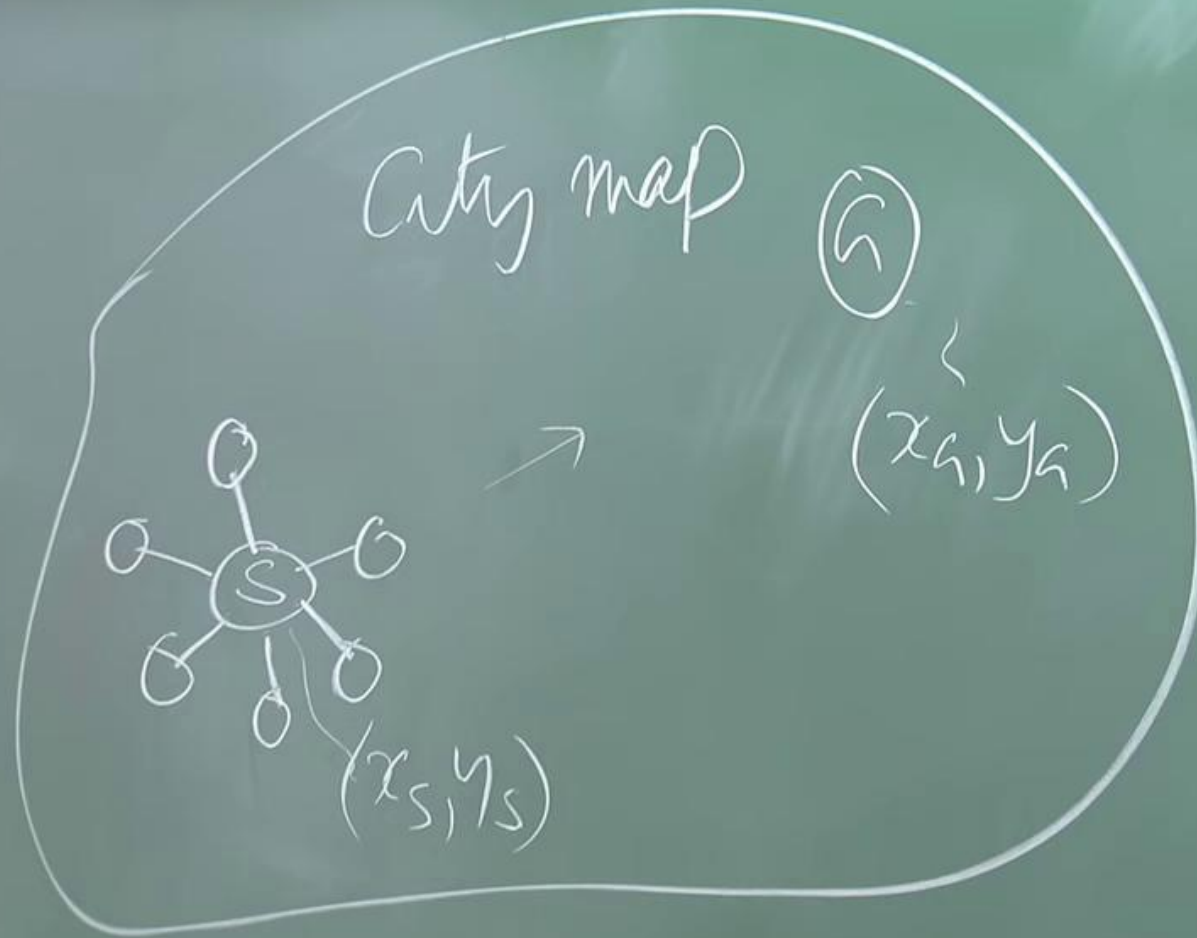
City map

G



Search

ent



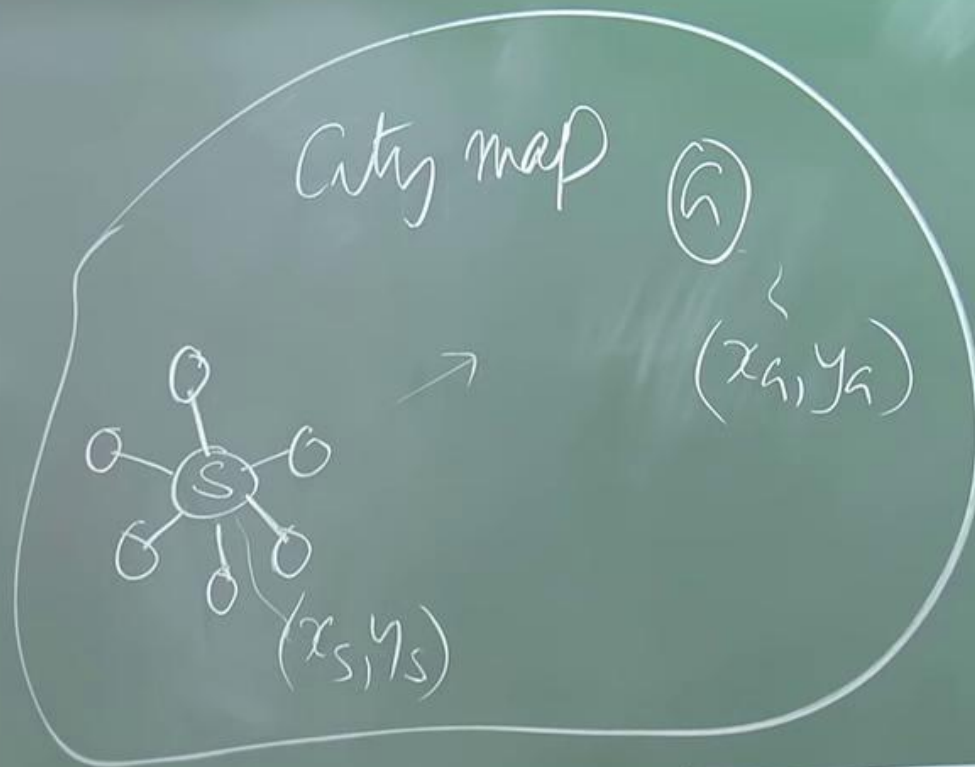
City  $h(n)$



ue Search

TIC Search

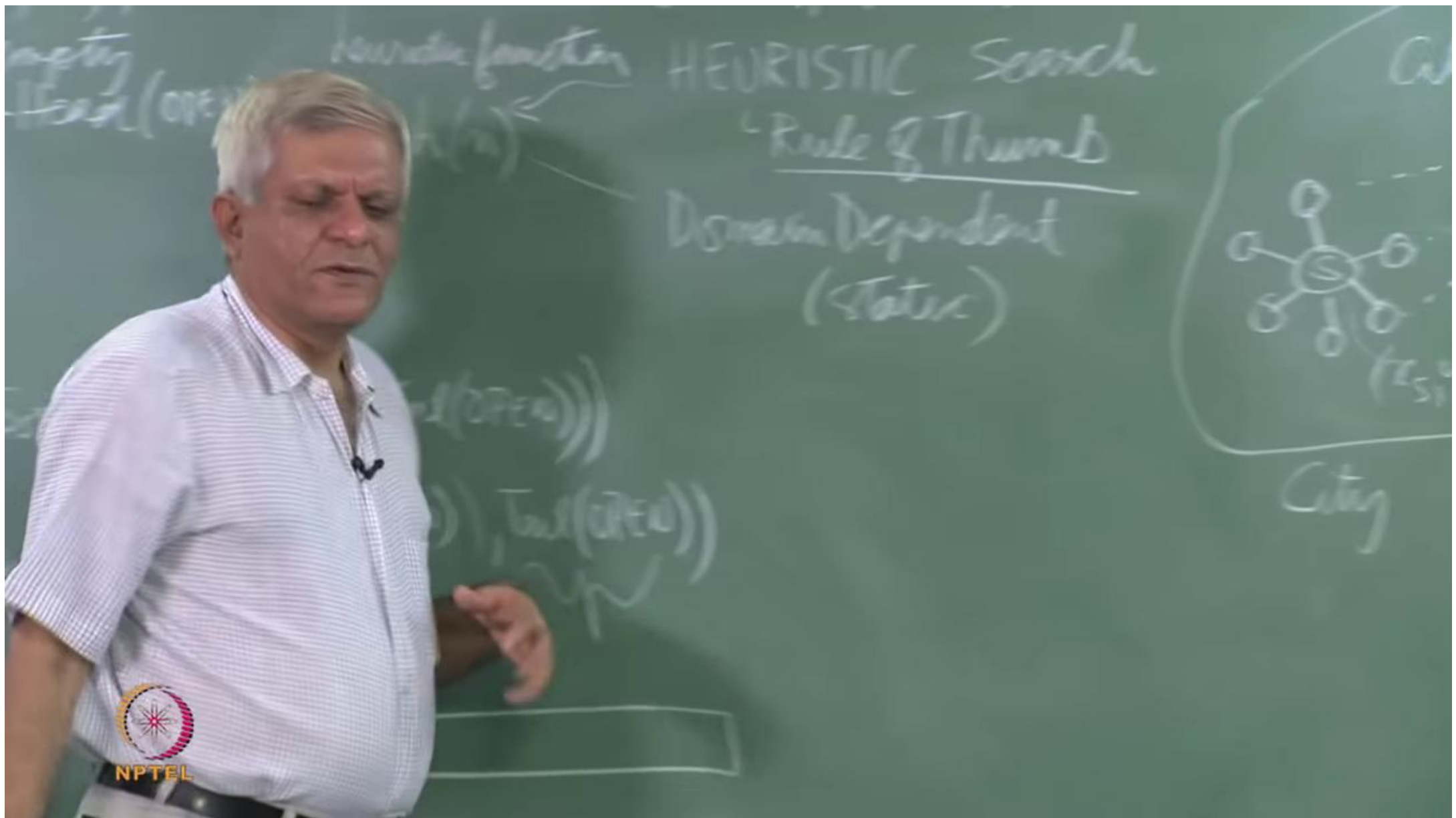
Dependent  
(static)



City

$$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$$

Euclidean.



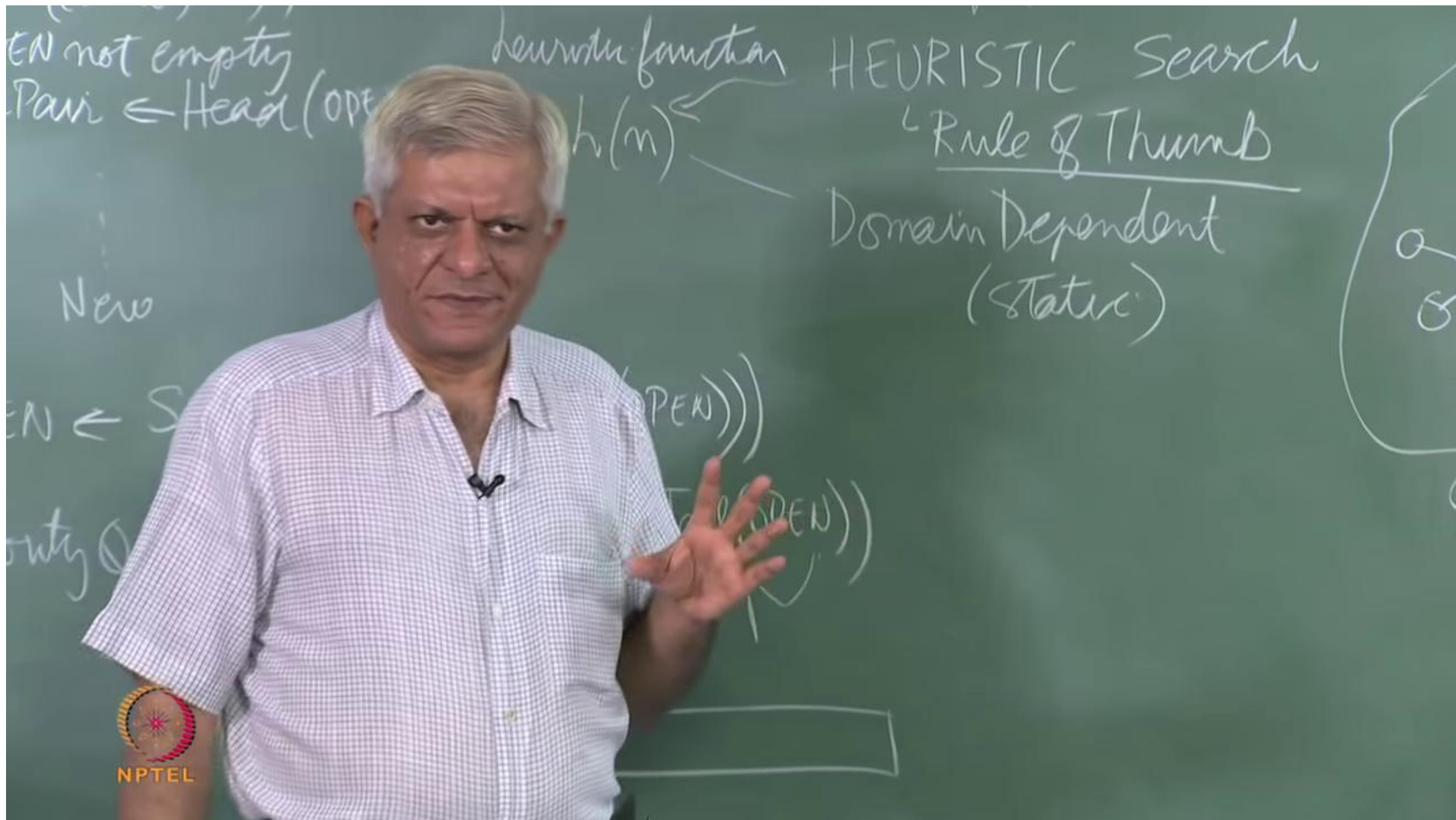
State Space Search

heuristic function HEURISTIC Search

$h(n)$

Rule of Thumb

Domain Dependent  
(Static)





than HEURISTIC Search  
Rule of Thumb  
Dependent  
(Static)



City  $h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$   
Euclidean.



$$h(n) = \sqrt{(x_s - x_n)^2 + (y_s - y_n)^2}$$

Euclidean.

$$= |x_s - x_n| + |y_s - y_n|$$

City

$$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$$

Euclidean

$$= |x_s - x_g| + |y_s - y_g|$$

Manhattan distance

City map

2	4	8
3	6	7
1	5	

24-puzzle  
Rubik's cube  
 $b = 18$

$$18^{10} \approx 35$$

$$(18^{20}) \approx 12$$

40 Billion  
Centuries

$$10^{19}$$
$$10^{17}$$
$$10^{15}$$
$$10^{13}$$

$$^2 + (y_5 - y_4)^2$$

Manhattan distance

Why map

2	4	8
6	7	
3	1	5

24-puzzle  
Rubik's cube  
 $b = 18$

$$18^{10} \approx 35$$

$$(18^{20}) \approx 127$$

40 Billion  
Centuries

$10^{19}$   
 $10^{17}$   
 $10^{15}$   
 $10^{13}$

$$^2 + (y_s - y_a)^2$$

$|x_s - x_a| + |y_s - y_a|$   
Manhattan distance



$$\begin{pmatrix} 2 & 4 & 8 \\ 6 & 7 \\ 3 & 1 & 5 \end{pmatrix}$$

$$\begin{pmatrix} 2 & 4 & 8 \\ 3 & 6 & 7 \\ 1 & 5 \end{pmatrix}$$

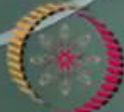
$$\begin{pmatrix} 2 & 4 & 8 \\ 6 & 7 \\ 3 & 1 & 5 \end{pmatrix}$$

$$\begin{pmatrix} 4 & 8 \\ 2 & 6 & 7 \\ 3 & 1 & 5 \end{pmatrix}$$

2  
Rub

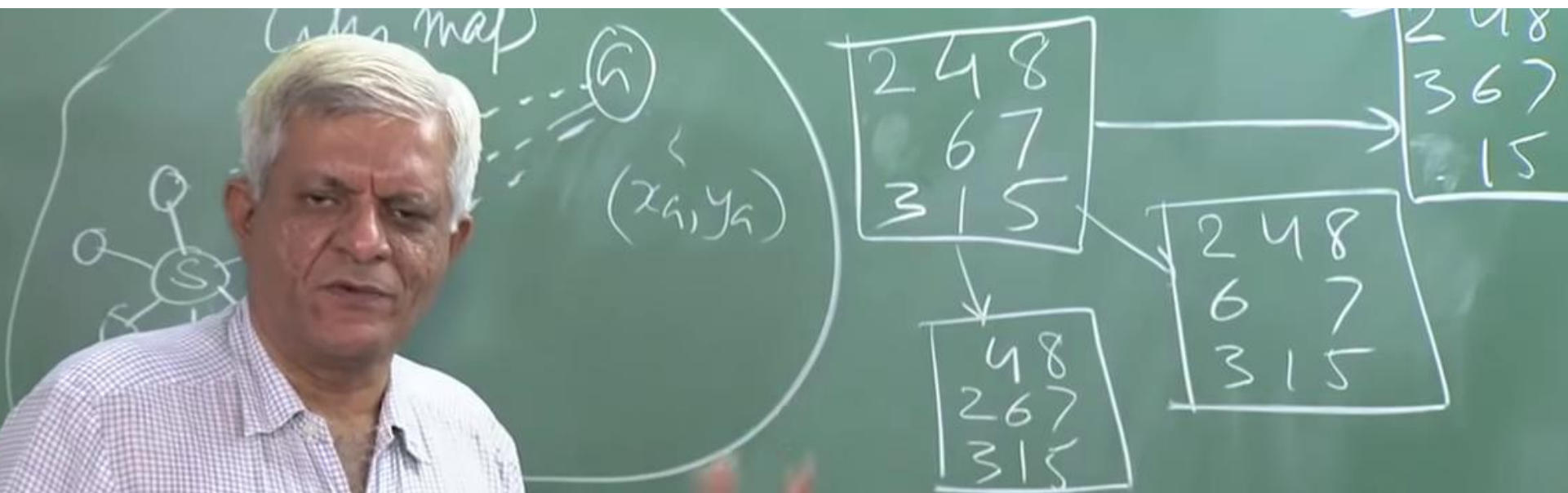
18<sup>10</sup>

18<sup>20</sup>



NPTEL





$$= \sqrt{(x_5 - x_1)^2 + (y_5 - y_1)^2}$$

slideam.

$$= |x_5 - x_9| + |y_5 - y_9|$$

## Manhattan distance

2	4	8
	6	7
3	1	5

2	4	8
3	6	7
		15

	4	8
2	6	7
3	1	5

2	4	8
6		7
3	1	5

24-pr

Search of Thum  
pendent  
ature)

City map

$(x_s, y_s)$

$(x_g, y_g)$

2	4	8
	6	7
3	1	5

2	4	8
6		7
3	1	5

4	8
2	6
3	1
5	

$$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$$

Euclidean.

$$= |x_s - x_g| + |y_s - y_g|$$

Manhattan distance

NPTel



city map

$(x_s, y_s)$

$(x_n, y_n)$

2	4	8
	6	7
3	1	

→

2	4	8
3	6	7
		15

15-puzzle -  $10^{12}$

24-puzzle -  $10^{24}$

$h_1(n) = \sum \text{dist. to goal}$   
for each tile

$\frac{1+2+3}{2}$

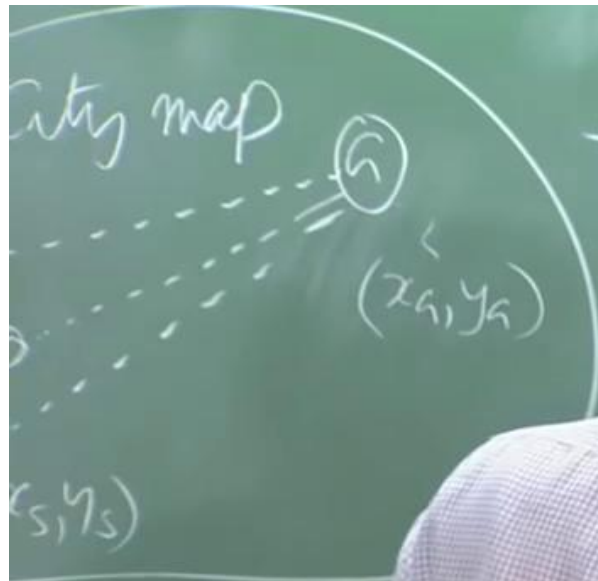
$h(n) = \sqrt{(x_s - x_n)^2 + (y_s - y_n)^2}$

Euclidean distance

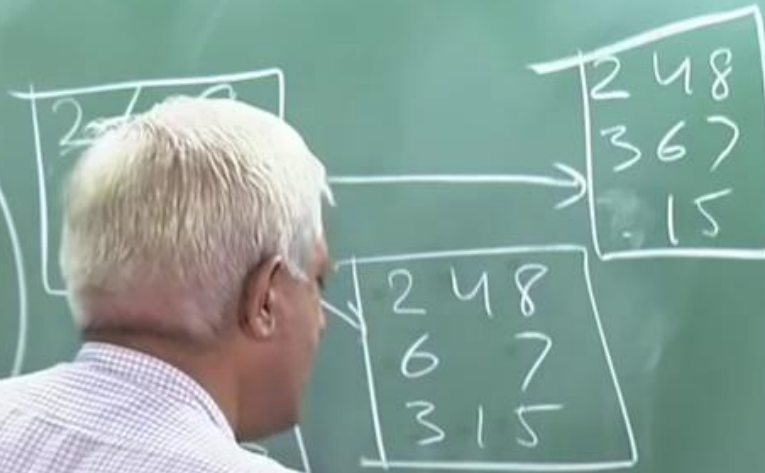
$= \sqrt{x^2 + y^2}$

1	2	3
8		4
7	6	5

NPTEL



$$h(n) = \sum$$



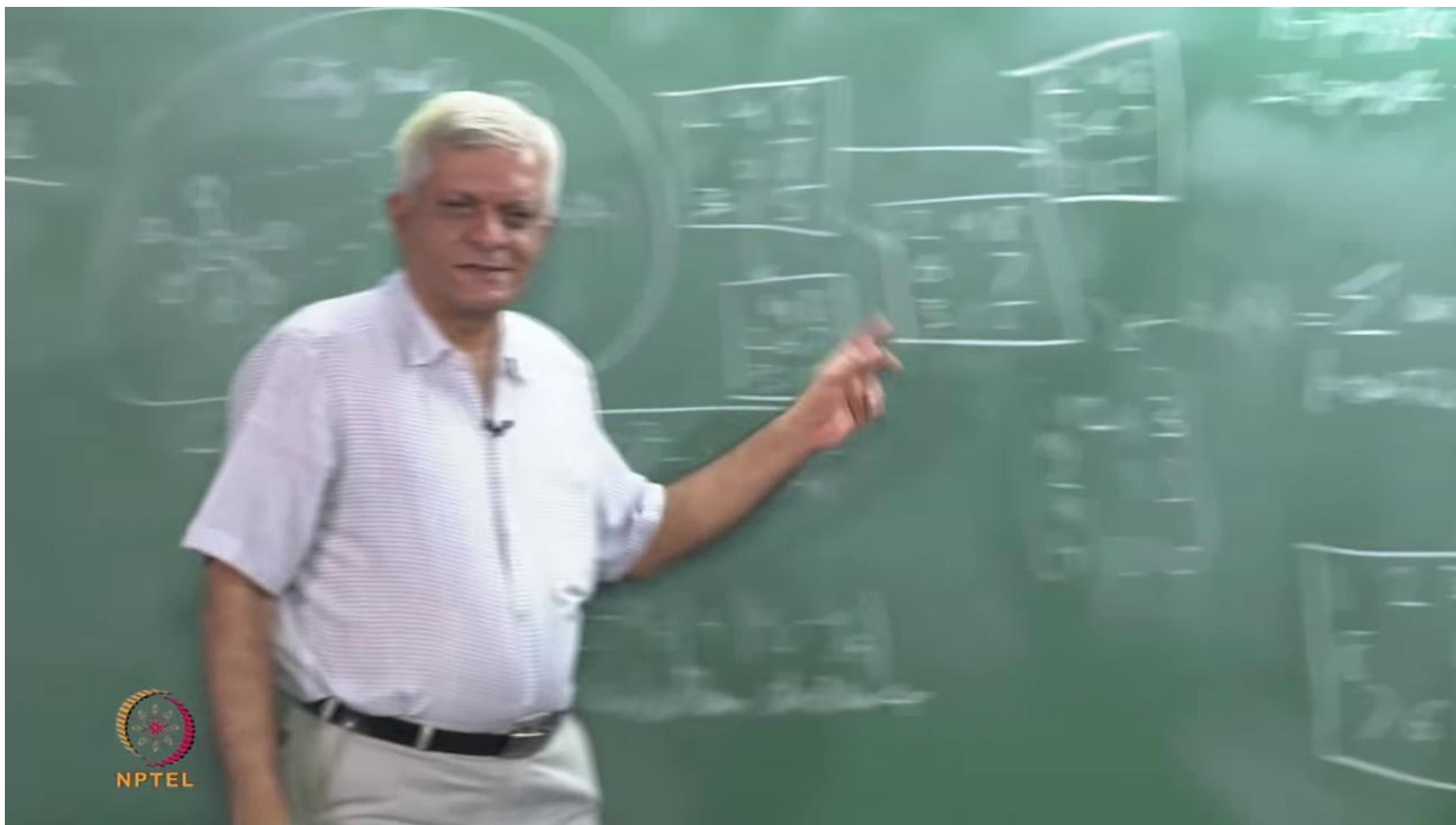
15-puzzle -  $10^{12}$   
24-puzzle -  $10^{24}$

$$h_1(n) = \sum \text{dist. to goal for each tile}$$

$$\begin{aligned} &1+2+3 \\ &+2+3 \\ &+4+3+0 \end{aligned}$$







[3 1 5]

$\leftarrow h_1(n) = 2$

for each

[1 2 3  
2 3  
4 3 0]



NPTEL

for each tile

$h_2(n) = \text{no. of misplaced tiles}$

1	2	3
---	---	---

Effective Branching Factor

$$= \frac{\text{no. of nodes seen}}{\text{length of solution}}$$



← Head (OPEN)

← Rule of Thumb

Domain Dependent (Static)


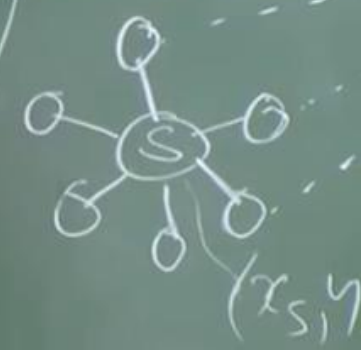
Sort, (OPEN)))

Queue Tail((

City

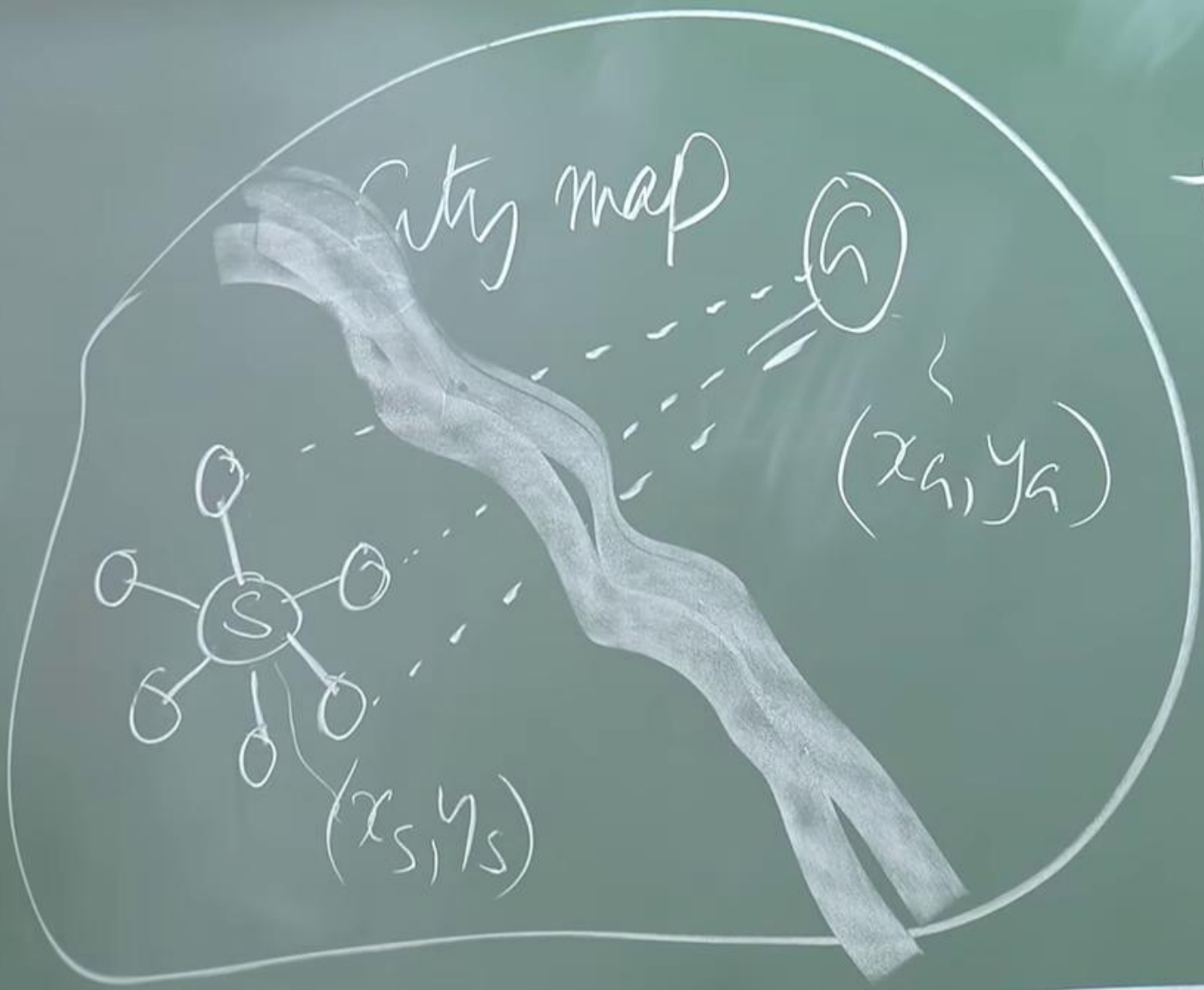
Effective Branching Factor

=  $\frac{\text{no. of nodes seen}}{\text{length of solution}}$





Search  
Search  
humb  
dent  
c)

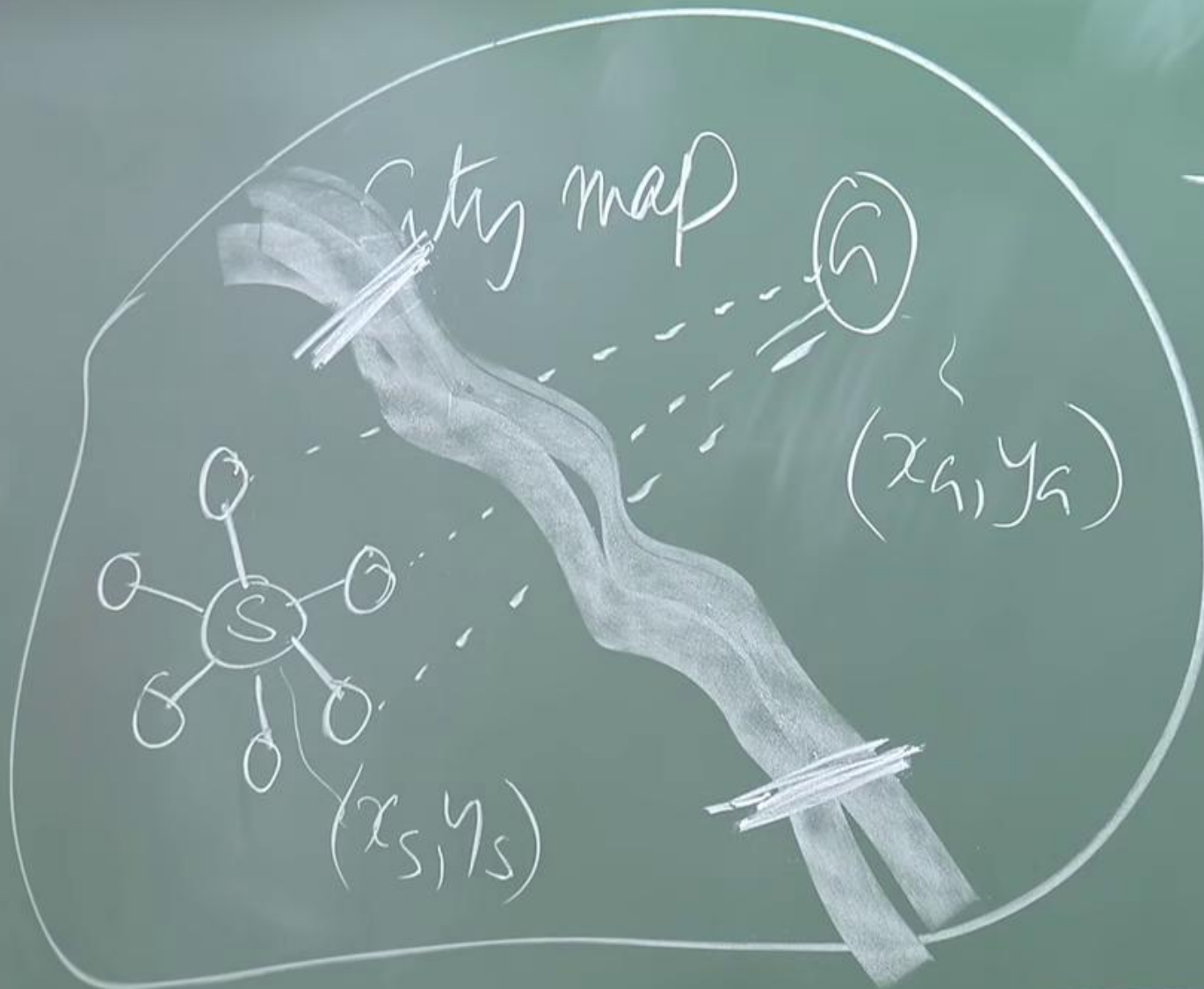


2	4	8
	6	7
3	1	5

↓

4
26
31

Search  
Search  
humb  
dent

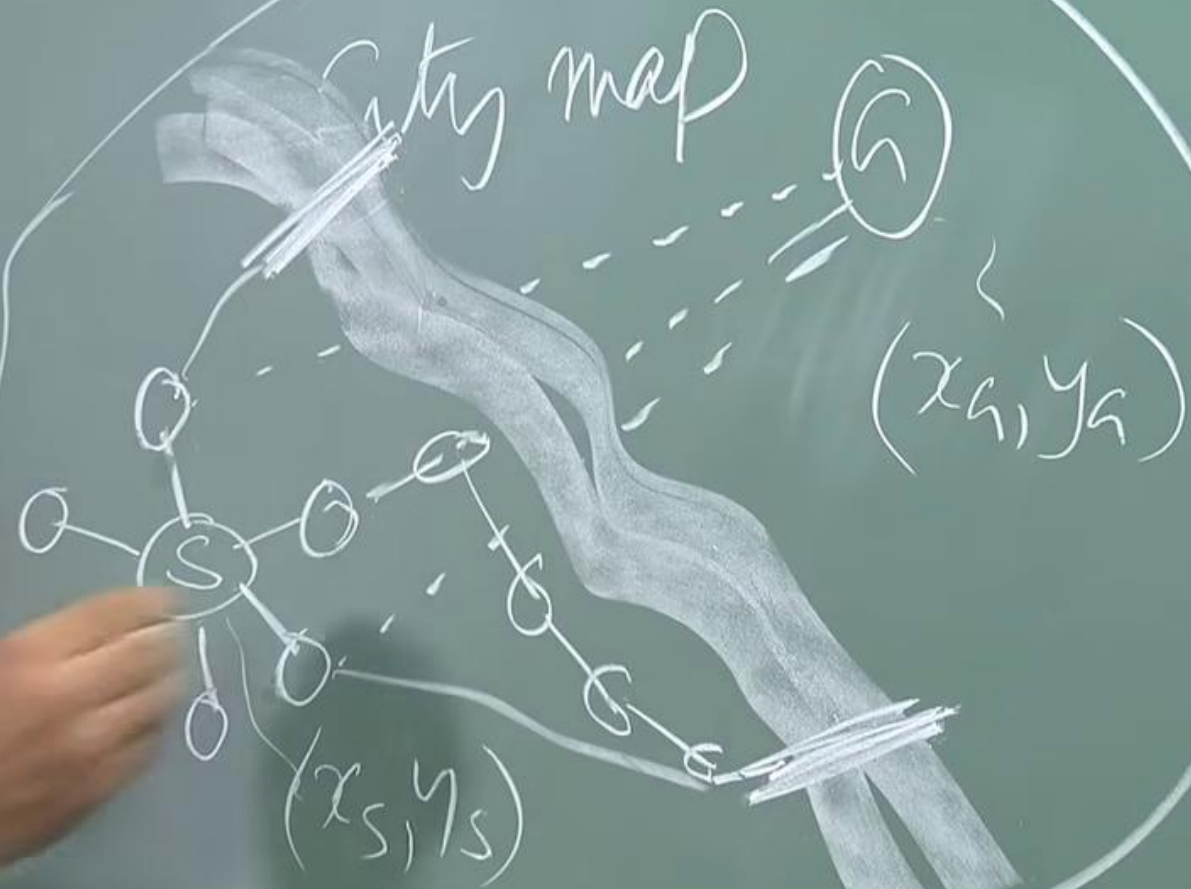


2	4	8
	6	7
3	1	5

↓

4
26
31

Search  
Search  
humb  
dent  
c)



2	4	8
	6	7
3	1	5

↓

4
26
31



THEORETICAL SEARCH

Rule of Thumb

Domain D

$f(n)$

$g(OPEN)$

$g(OPEN)$ , Tail

length of solution

number of nodes

City

$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$

Euclidean

$= |x_s - x_g| + |y_s - y_g|$

Manhattan

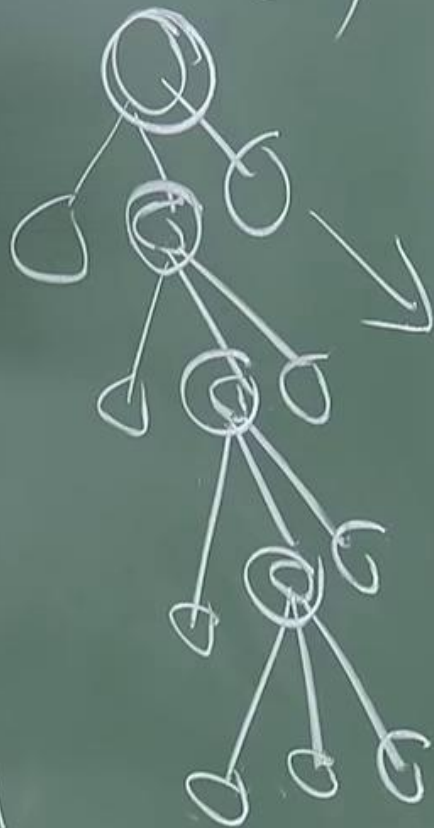
City

$$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$$

Euclidean

$$= |x_s - x_g| + |y_s - y_g|$$

Manhattan distance



Branching Factor

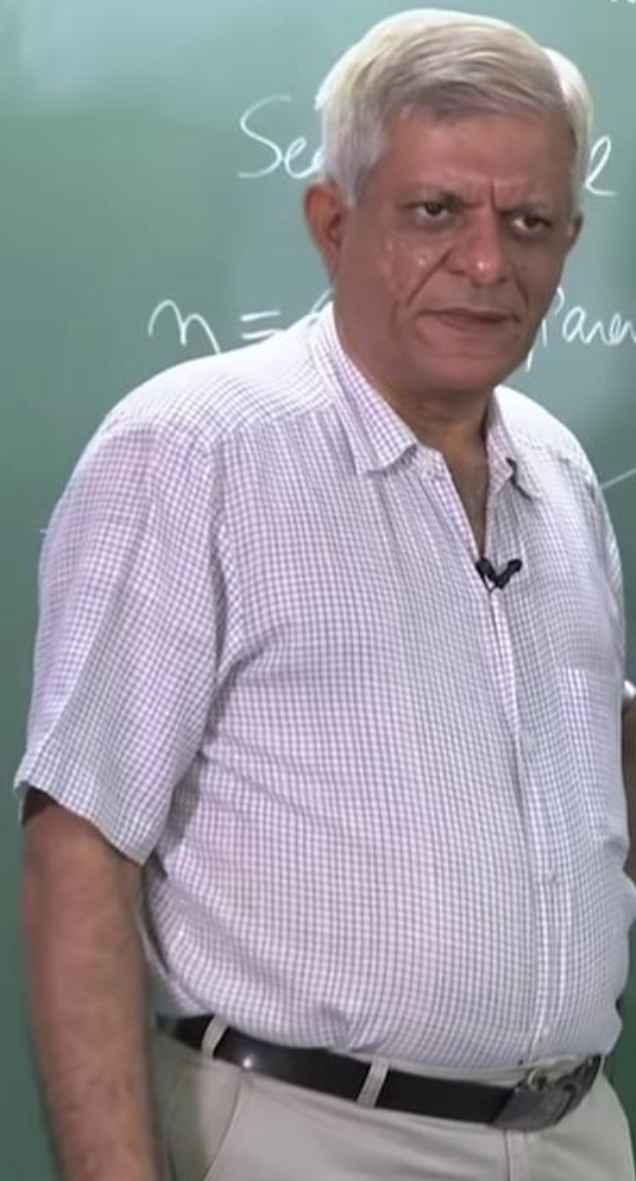
& nodes seen

length of solution



Best First Search

Completeness



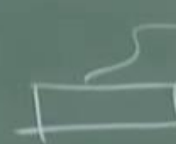
While OPEN not empty  
 $\text{NodePair} \leftarrow \text{Head}(\text{OPEN})$

See

$n = \text{Node}(\text{parent}, h)$

New

$\text{OPEN} \leftarrow \text{Sort}_h(\text{Append}(\text{New Tail}(\text{Merge}(\text{sort}(\text{New}))))$   
Priority Queue



Best First Search

Completeness

Time / Space

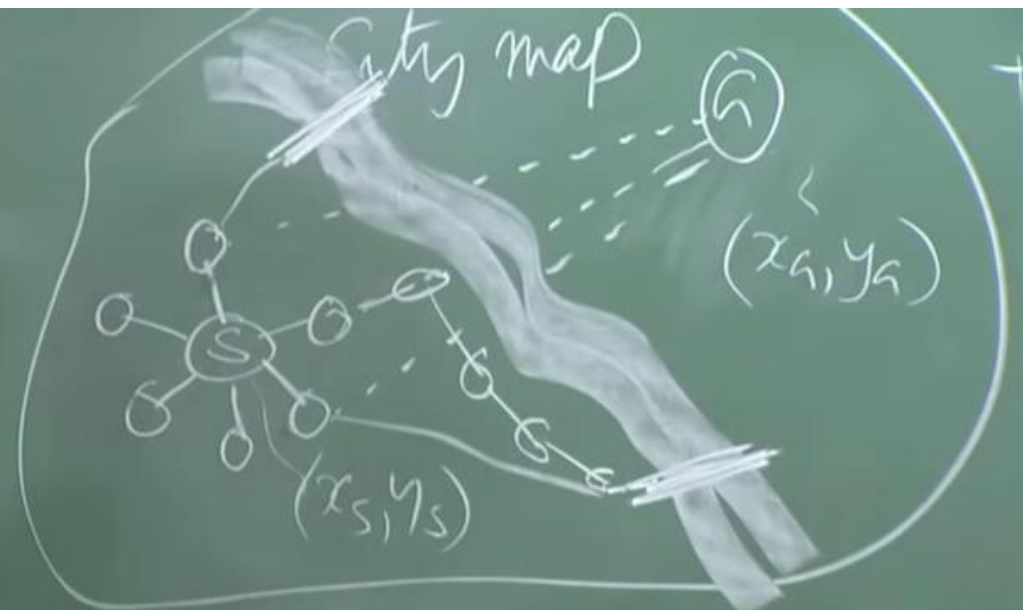


# HEURISTIC Search

Rule of

Domain Dep

(S)



with function  
 $h(n)$

$\text{Tail}(\text{OPEN}))$

$\text{new}), \text{Tail}(\text{OPEN})$   
up

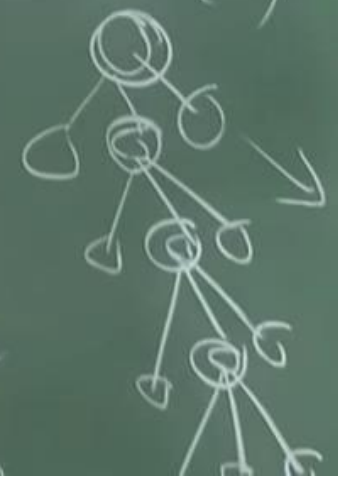
City

$$h(n) = \sqrt{(x_s - x_g)^2 + (y_s - y_g)^2}$$

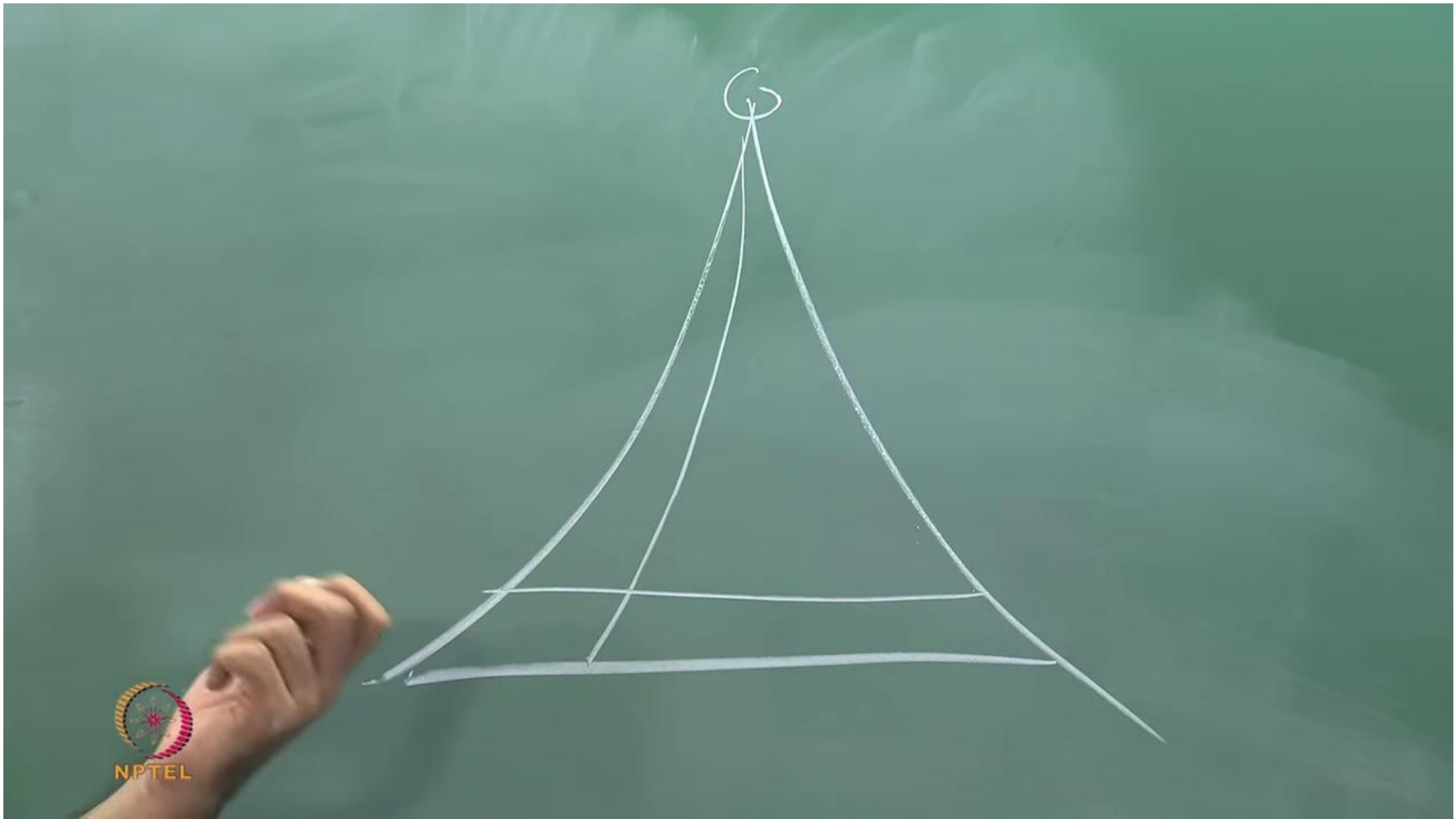
Euclidean

$$= |x_s - x_g|$$

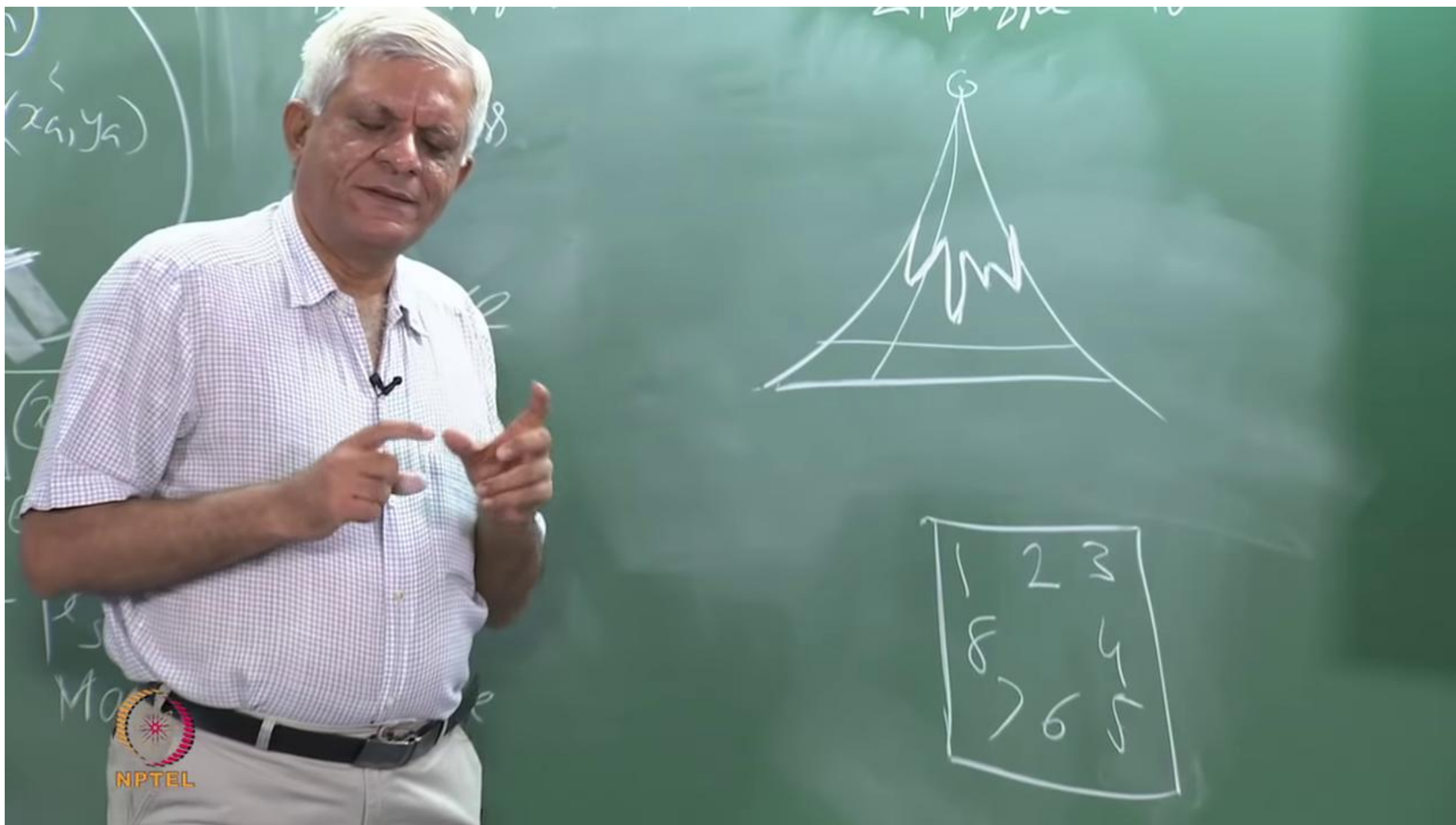
Manhattan

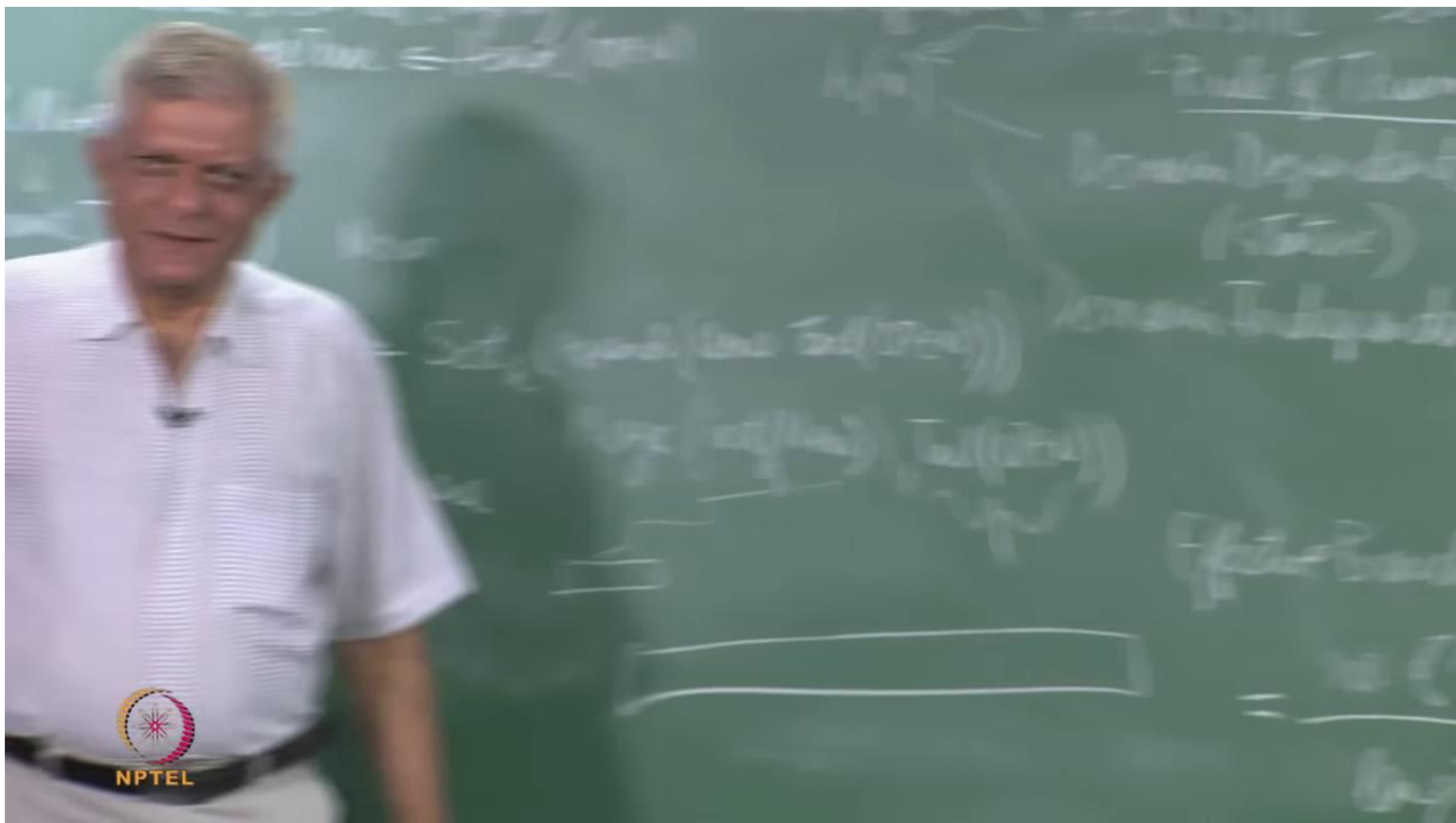












HEURISTIC Search

Rule of Thumb

$h(n)$


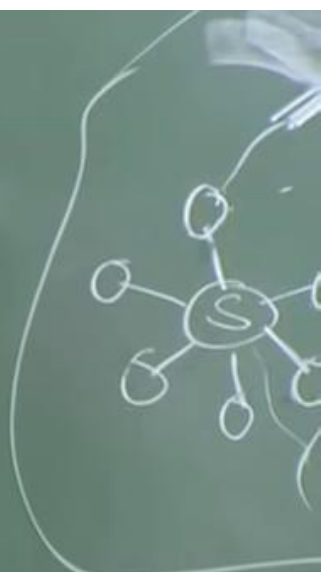
- Domain Dependent (Static)
- Domain Independent

$h(n) = \text{cost}(\text{New Tail}(\text{OPEN}))$

$\text{cost}(\text{New Tail}(\text{OPEN})) = \text{cost}(\text{New}) + \text{cost}(\text{Tail}(\text{OPEN}))$

City

Effective Branching Factor

$$= \frac{\text{no. of nodes seen}}{\text{length of solution}}$$


in  $\leftarrow \text{Head}(\text{OPEN})$

New

$\leftarrow \text{Sort}_h(\text{Append}(\text{OPEN}))$

Queue

Met

Tail(OPEN)

HEURISTIC Search

Rule of Thumb

Domain Dependent  
(Static)

Domain Independent

Solves a RELAXED Problem

City

Effective Branching Factor

$$= \frac{\text{no. of nodes seen}}{\text{length of solution}}$$





