

Heuristic Search

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modul di NUS

CS3243 - Introduction to Artificial
Intelligence

prerequisite

tau graph

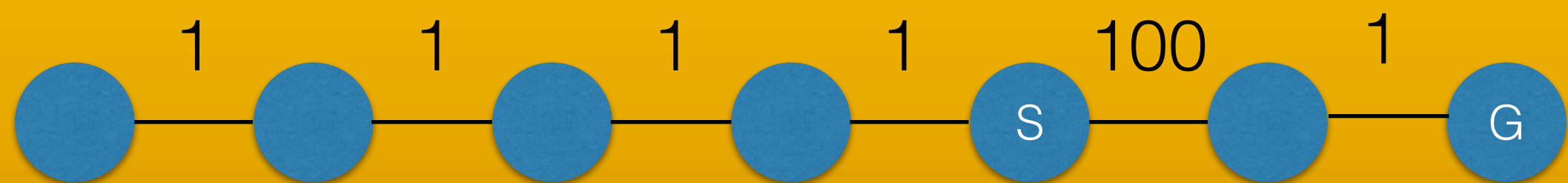
tau BFS+DFS

tau Dijkstra

motivation buat hari ini

ada gak yang (generally) lebih “cepat” dari Dijkstra?

kalau gak ada, ngapain
ada materi hari ini?



ide : kita mo traverse dari yang paling “deket” dulu, most likely finish duluan

bikin $f(n)$ untuk tiap node n .

$f(n)$ = “estimate cost”

terus kita traverse nya based
on increasing $f(n)$

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on increasing $f(n)$

bisa pake pqueue

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure

node \leftarrow a node with STATE = *problem*.INITIAL-STATE, PATH-COST = 0

frontier \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*frontier*) **then return** failure

node \leftarrow POP(*frontier*) /* chooses the lowest-cost node in *frontier* */

if *problem*.GOAL-TEST(*node*.STATE) **then return** SOLUTION(*node*)

 add *node*.STATE to *explored*

for each *action* **in** *problem*.ACTIONS(*node*.STATE) **do**

child \leftarrow CHILD-NODE(*problem*, *node*, *action*)

if *child*.STATE is not in *explored* or *frontier* **then**

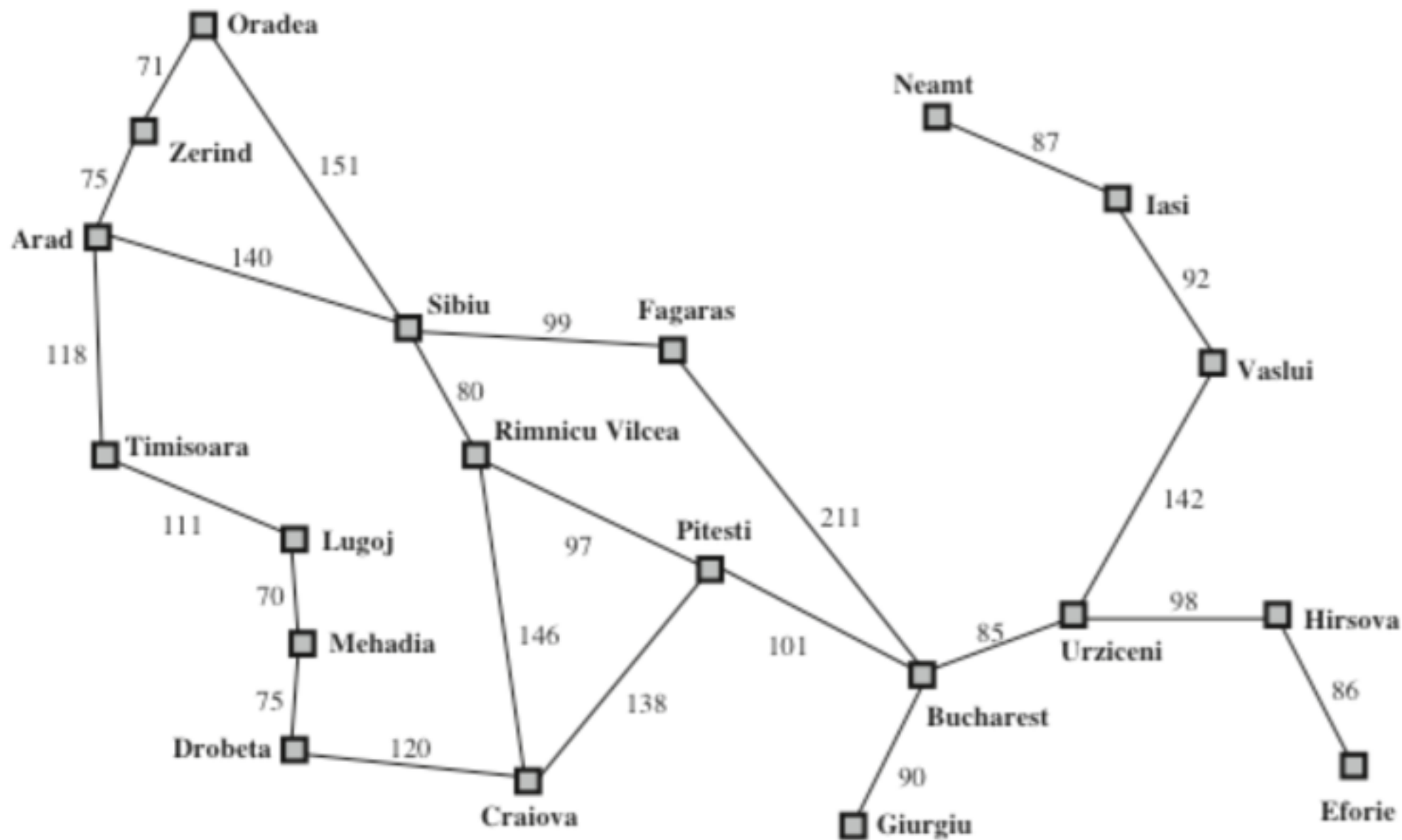
frontier \leftarrow INSERT(*child*, *frontier*)

else if *child*.STATE is in *frontier* with higher PATH-COST **then**

 replace that *frontier* node with *child*

kalo dijkstra, $f(n)$ = jarak dari
start ke n .

contoh : mau ke Bucharest



Values of h_{SLD} - straight-line distances to Bucharest

Arad	366
Bucharest	0
Craiova	160
Drobeta	242
Eforie	161
Fagaras	176
Giurgiu	77
Hirsova	151
Iasi	226
Lugoj	244
Mehadia	241
Neamt	234
Oradea	380
Pitesti	100
Rimnicu Vilcea	193
Sibiu	253
Timisoara	329
Urziceni	80
Vaslui	199
Zerind	374

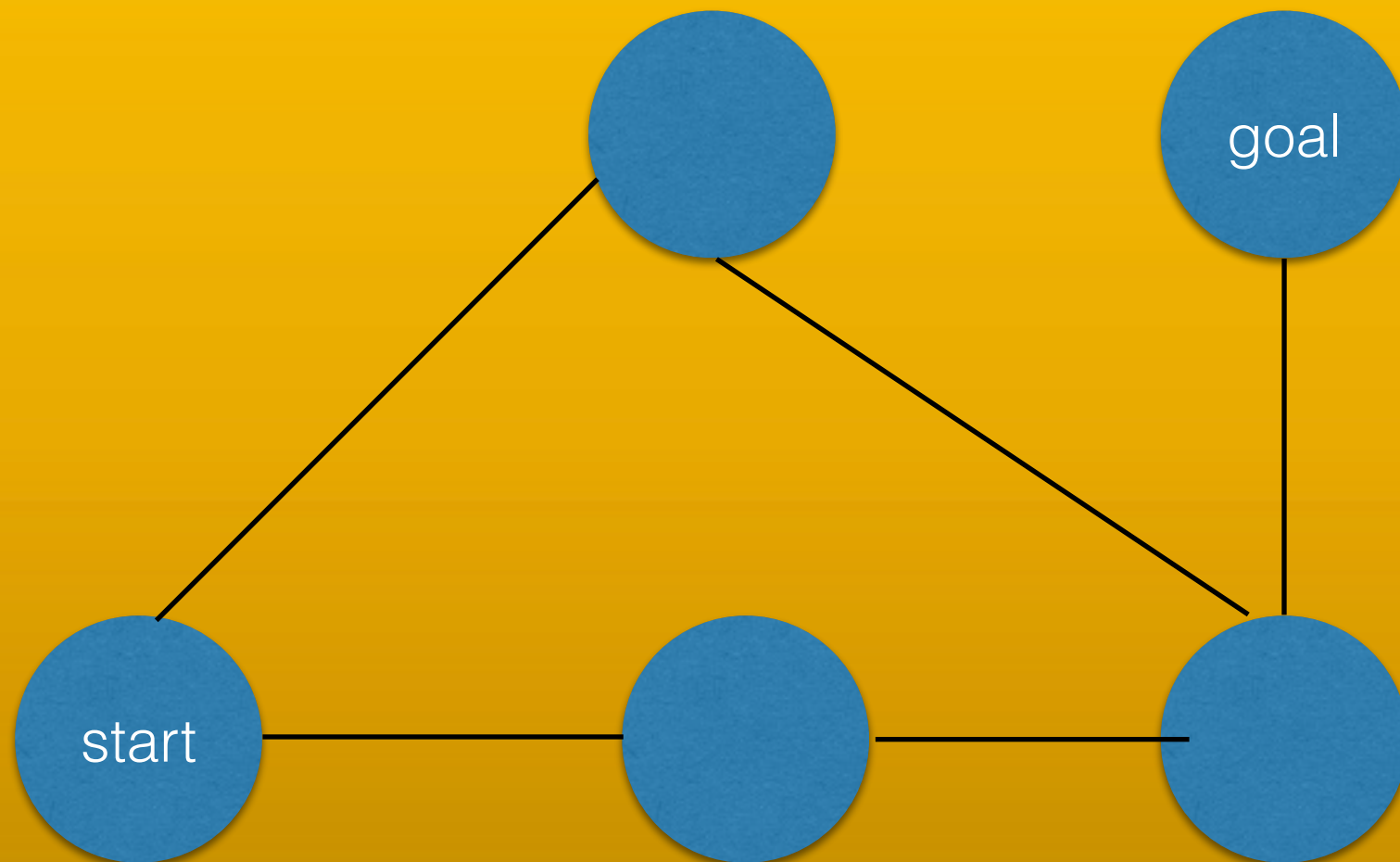
kita bikin heuristic function
 $h(n)$

let's say for now, $h(n)$ = straight
line distance dari n ke
Bucharest

Greedy Best First Search

$$f(n) = h(n)$$

gak optimal

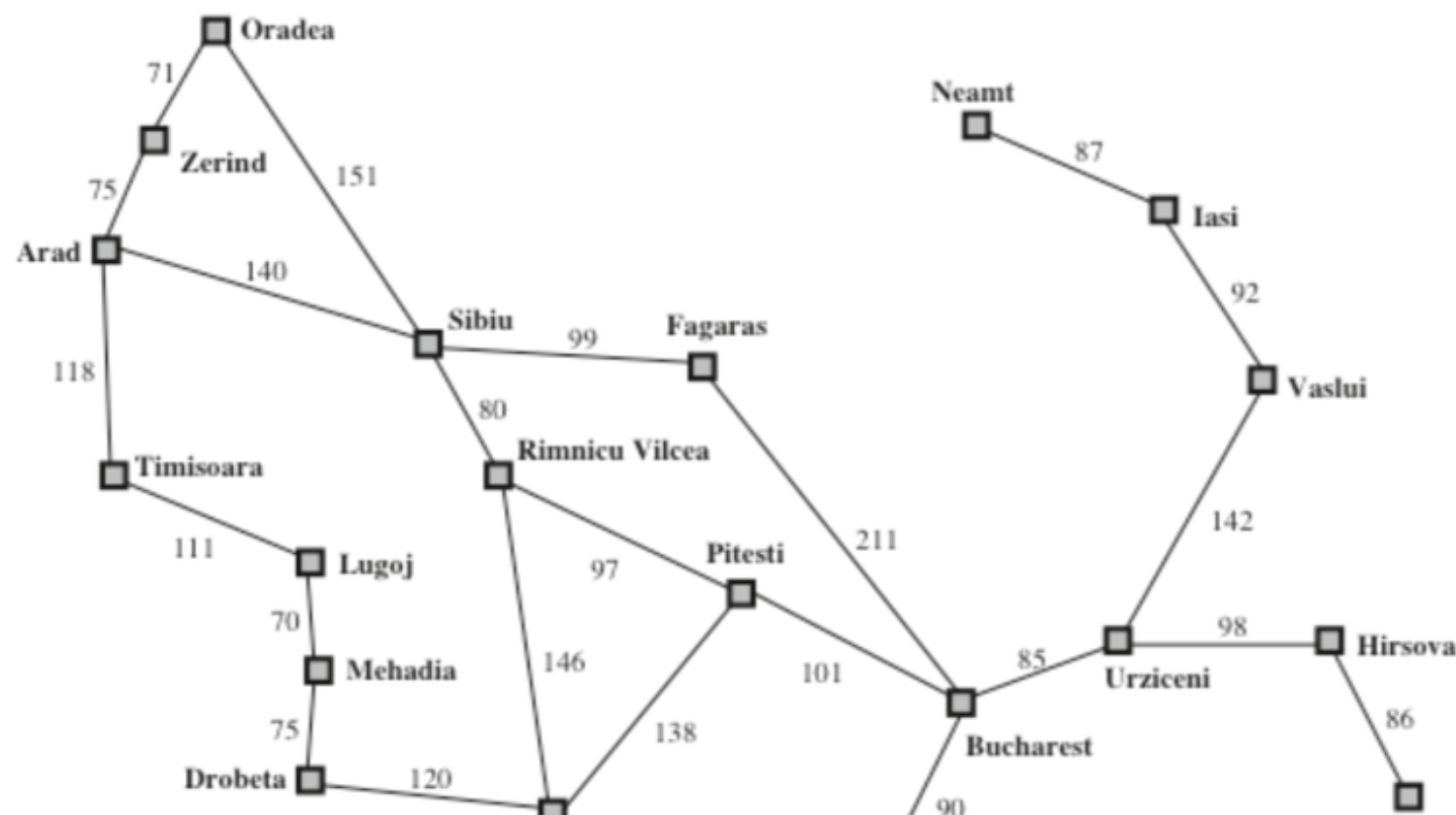


A* Search

ide : avoid path yang udah mahal

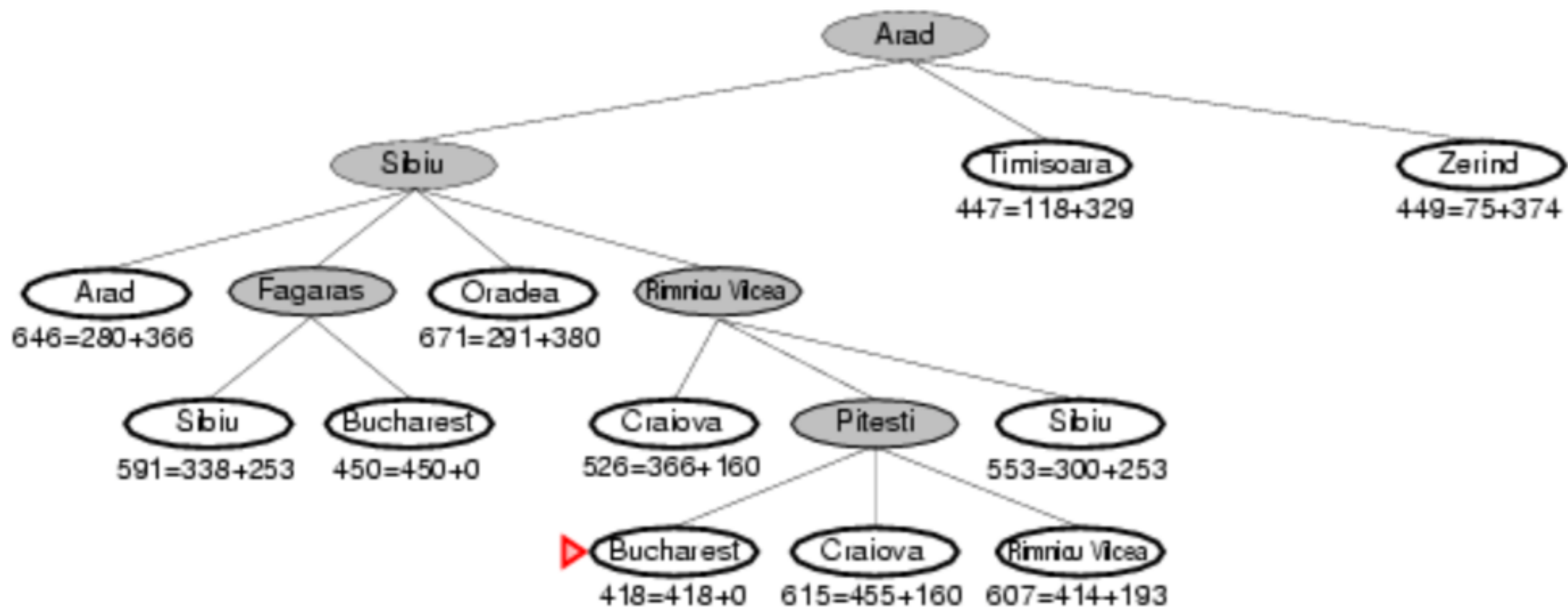
$$f(n) = g(n) + h(n)$$

$g(n)$ = cost dari start ke n



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gimana cari $h(n)$?

$h(n)$ itu **admissible** kalo dari semua node n , $h(n) \leq h^*(n)$

dimana $h^*(n)$ itu true-min-cost

contoh,
 $h(n)$ yang sebelumnya itu
admissible

intuitively, jalan belok2 gak akan
lebih pendek daripada jalan
lurus

why admissible?

$$f(x) = g(x) + h(x)$$

$$h(x) \leq h^*(x)$$

$$f(x) \leq g(x) + h^*(x)$$

why admissible?

idea : kalo lu pop sebuah finish
node x dari pqueue, berarti
semua element lain $f(x) \leq f(x')$.

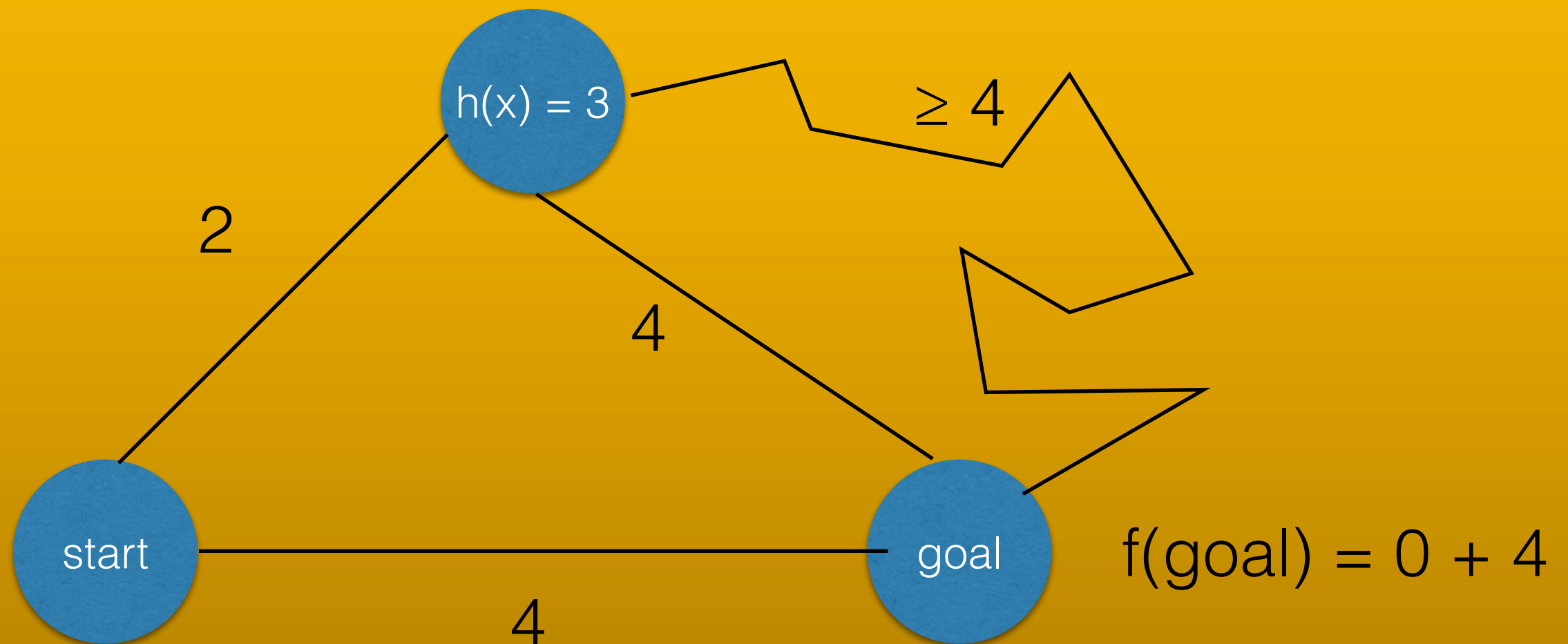
since $f(x') \leq g(x') + h^*(x')$

$$f(x) \leq g(x') + h^*(x')$$

maka x pasti optimal

contoh

$$f(x) = 2 + 3 = 5$$

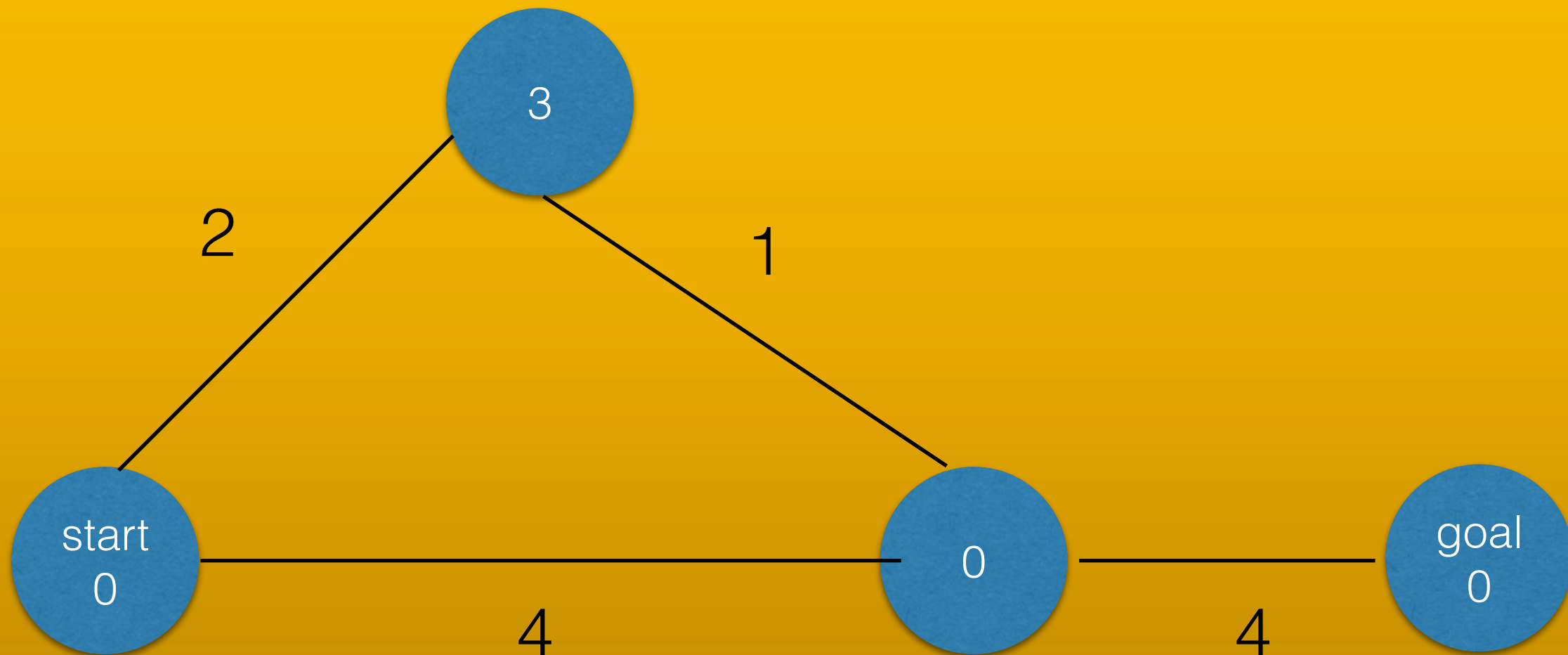


common mistake

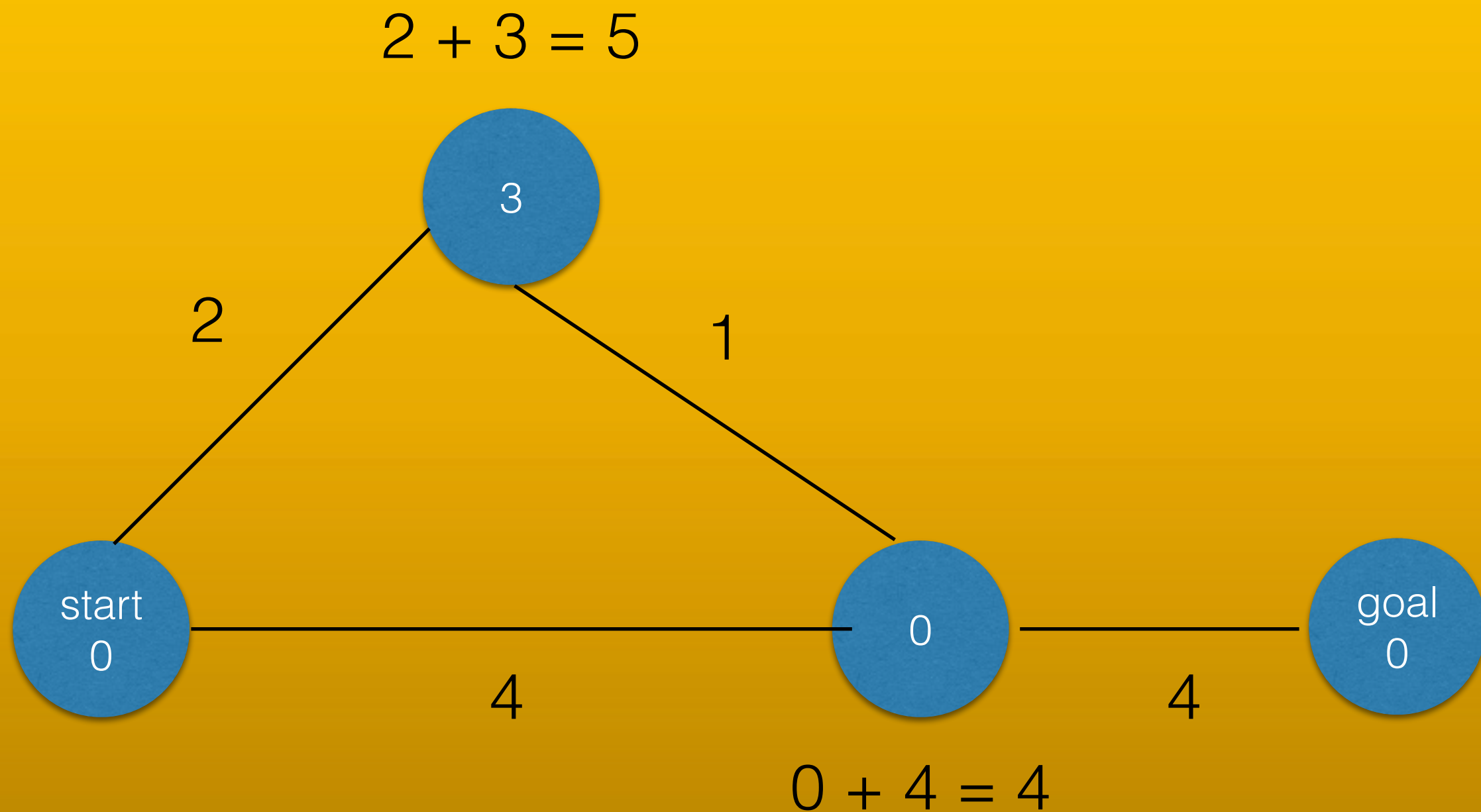
admissible doang ga cukup
buat A^*

gw “ditipu” pas pelatnas beberapa tahun lalu

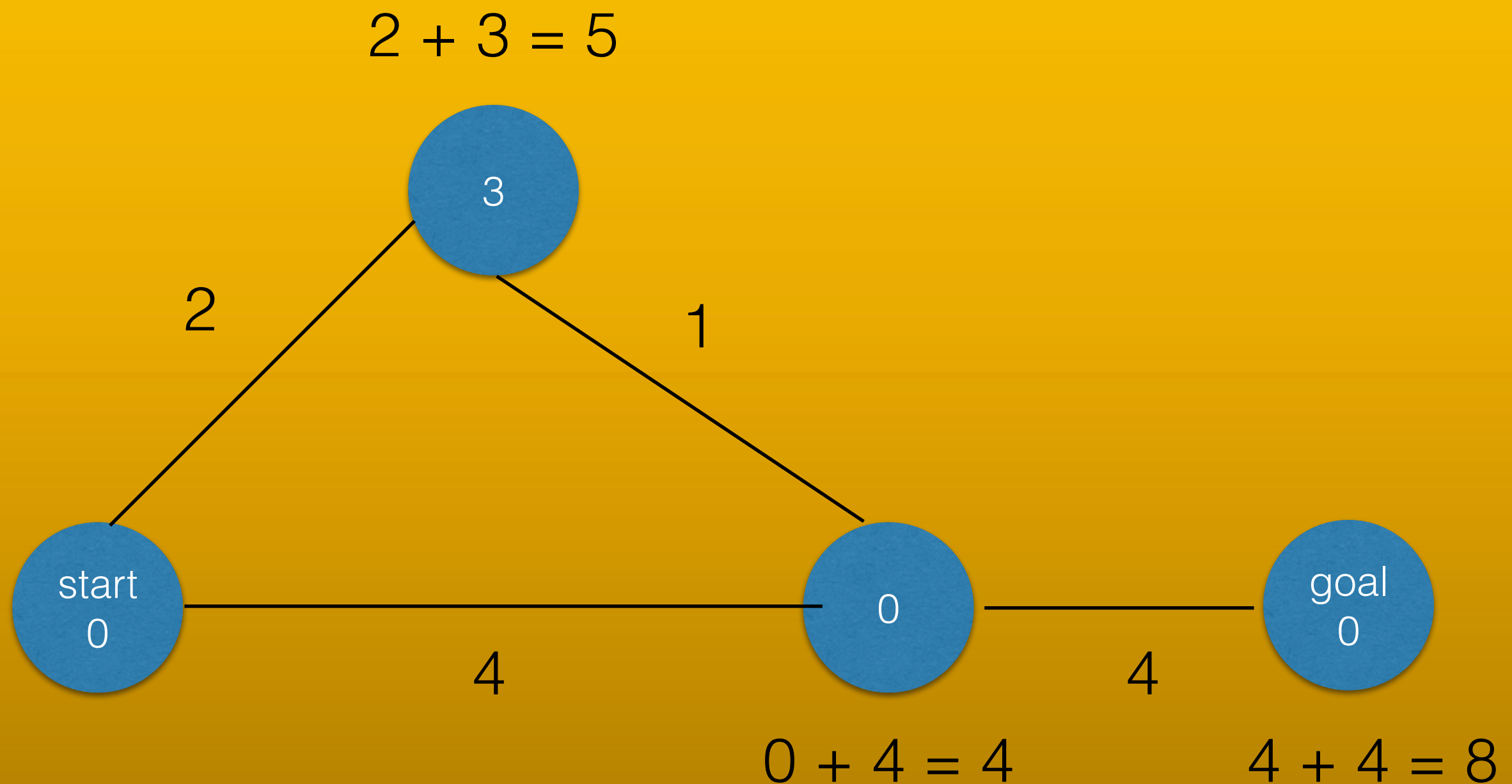
ini admissible, tapi gak optimal



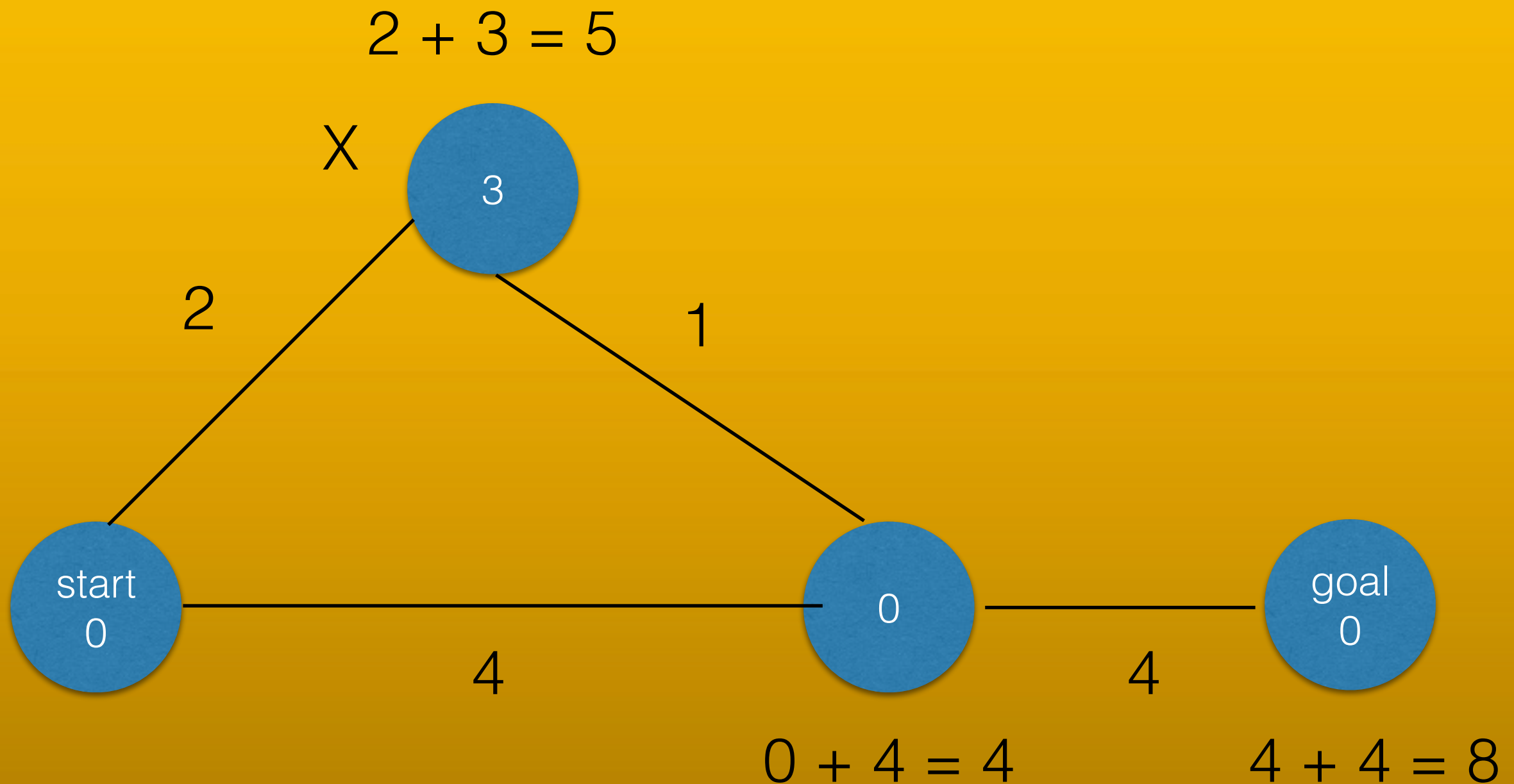
gak optimal



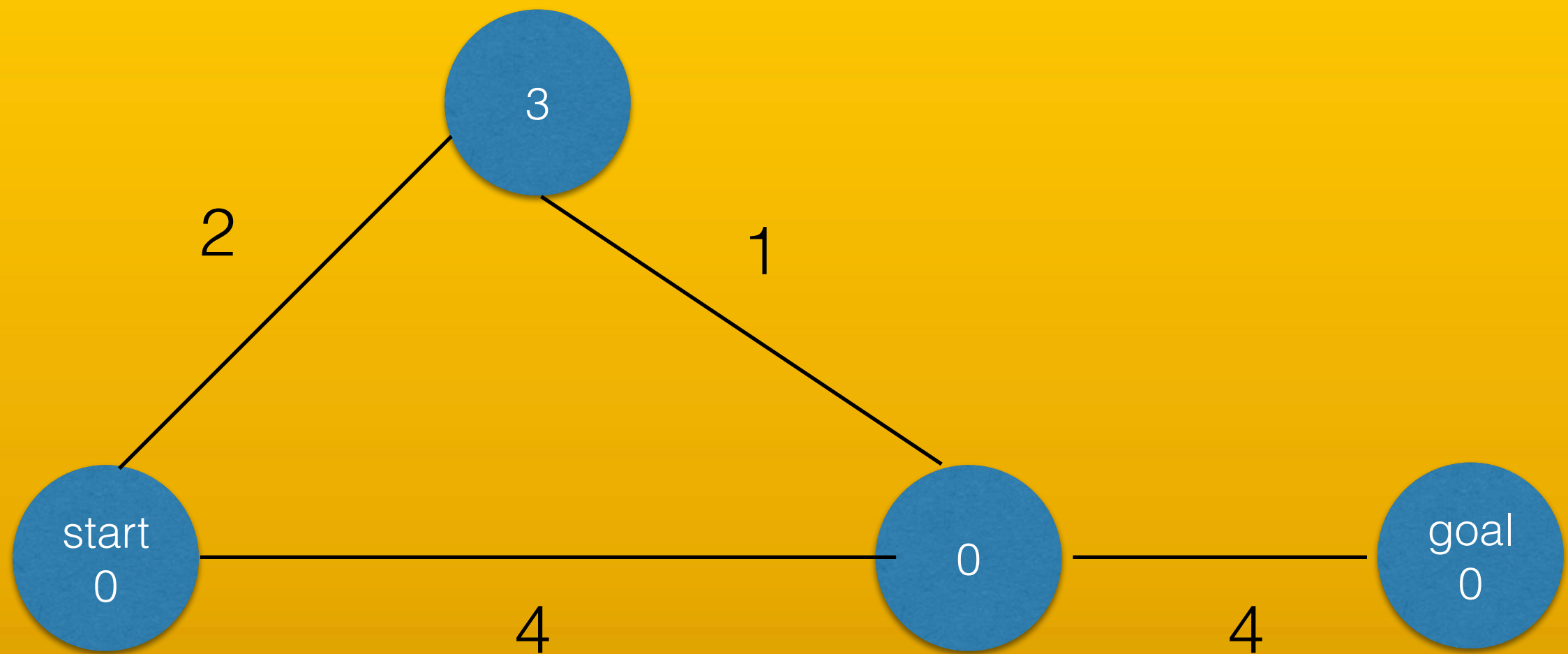
bakal pilih yang bawah duluan
karena $f(n)$ nya lebih kecil



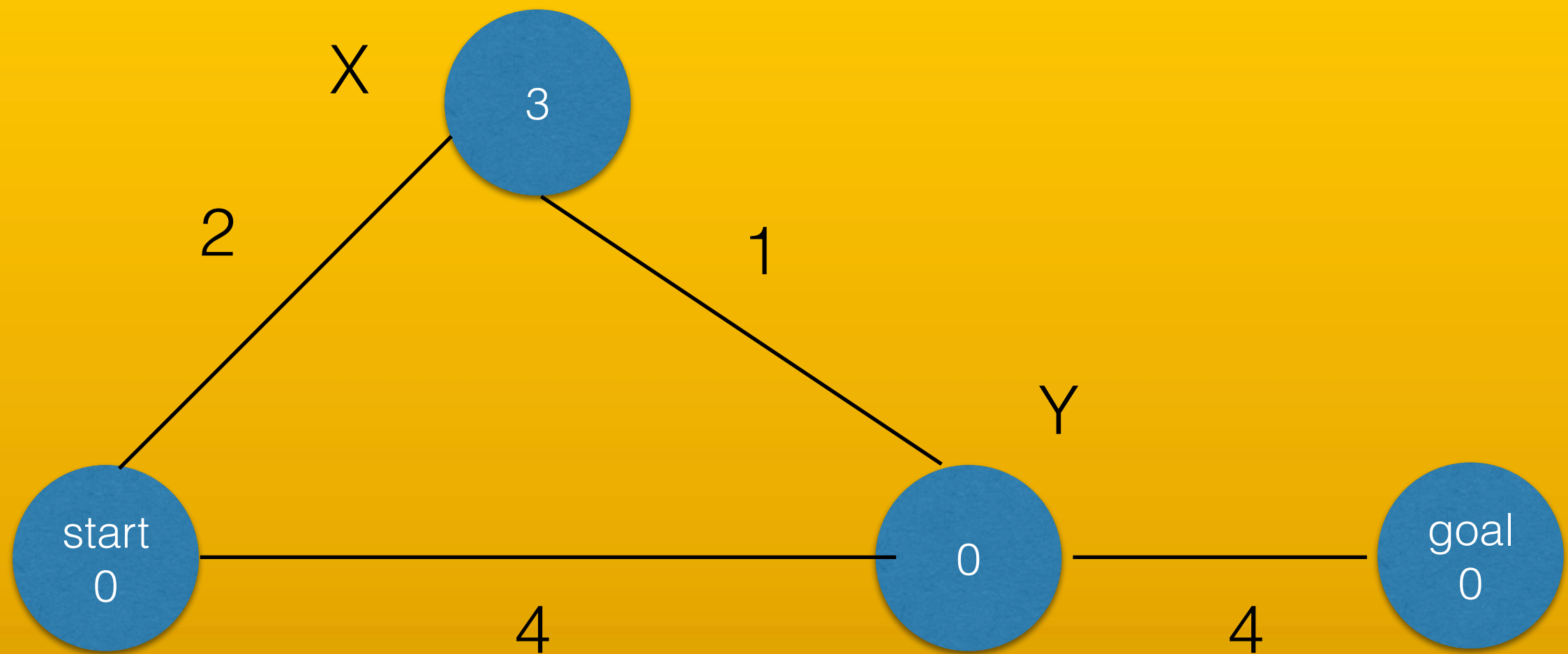
heuristic value X terlalu besar



$h(n)$ itu **consistent** kalo dari semua node n dan n' , $h(n) \leq h(n') + w(n, n')$



ini gak consistent



$$h(X) = 3, h(Y) = 0, w(X, Y) = 1$$

$$h(X) > h(Y) + w(X, Y)$$

bosen ah teori mulu

mari kita masuk contoh2 yang
aplikatif <3

contoh klasik
8-puzzle

A 3x3 grid with a light gray background and a white border. The grid contains the following numbers:

	1	2
3	8	7
4	6	5

BFS

$$O(\#state) = O(9!) = 362880$$

bisa sih, tapi coba kita solve
pake A^*

mari kita bikin $h(n)$

$h_1(n)$ = banyaknya tile salah
tempat

$h_2(n)$ = total manhattan distance
dari semua tile ke tempat
sebenarnya

□ $h_1(S) = ?$ 8

□ $h_2(S) = ?$ $3+1+2+2+2+3+3+2 = 18$

7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

Goal State

suppose h_1 sama h_2 dua2 nya
admissible, dan $h_2(n) \geq h_1(n)$
untuk semua n

kita bilang h_2 dominates h_1

h_2 generally bakal incurs lower
search cost than h_1

gimana cari heuristic function
yang admissible

game nya kita bikin relaxed
(e.g. tambah move allowed)

optimal cost dari relaxed
problem pasti admissible

kalo rule 8-puzzle, kita ganti
piece yang ngisi kotak kosong
boleh dari piece manapun
optimal cost $\Rightarrow h1$

kalo rule 8-puzzle, kita ganti

piece boleh gerak ke adjacent
square yang mana aja $\Rightarrow h2$

latihan yu....

dikasih grid $R \times C$. ada start position sama finish position.

lu boleh gerak 4 arah.

dibeberapa kotak ada obstacle

heuristicnya?

relaxed problem : anggap
obstaclenya gak ada

$h(n)$ = jarak manhattan dari n ke
finish

note : algo search apapun
(termasuk A^*) bakal search
semua node kalo finish position
not found

in other words, bakal as bad as any search algorithm yang lu
pelajari pas lu masih TK (DTK, BTK)

kalo di soalnya ada
if there is no solution,
 print -1
or sth like that which means gak
 guaranteed ada solusi

then it is **unlikely** that the
solution is to make the search
algorithm faster

unlikely \neq never

IDA*

Iterative Deepening A*

duh gw ngantuk, beresin slide ini sampe jam 1 pagi

mirip sama IDS, tapi kita pake
heuristic valuenya

kalo sebuah node n , $f(n)$
melebihi bound, fail. anggap
node n itu tidak ada

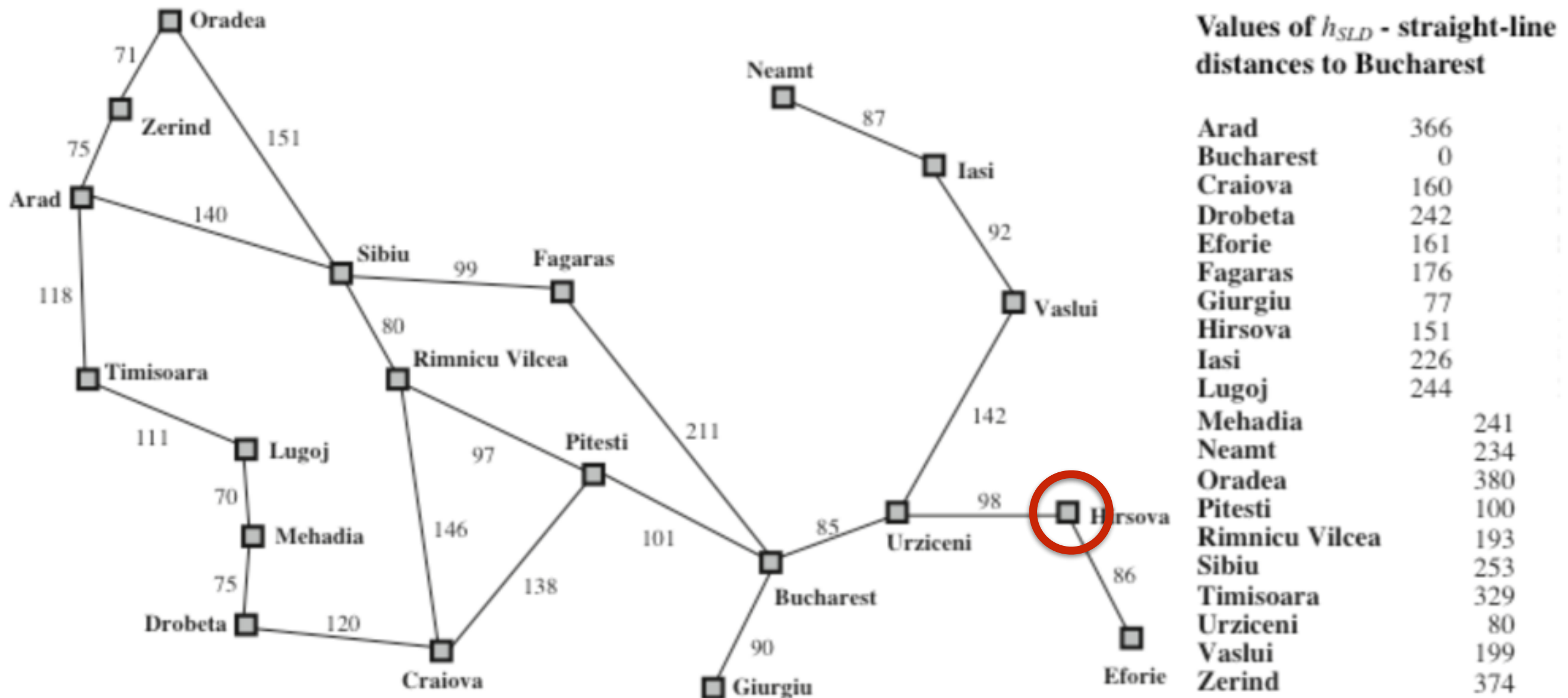
kalo finish found, return FOUND

otherwise, dari semua node n
yang $f(n) > \text{bound}$, ambil $f(n)$
terkecil dan jadiin bound baru

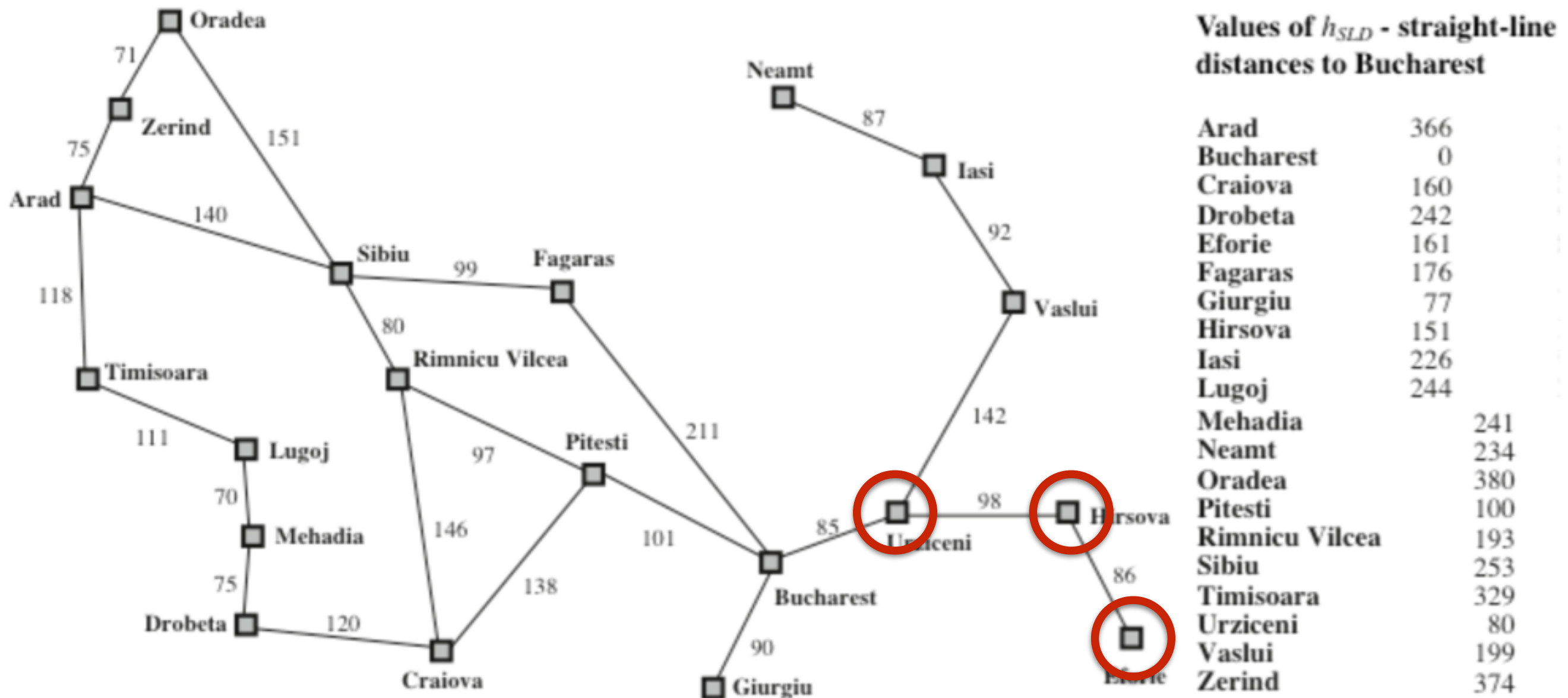
```
procedure ida_star(root)
  bound := h(root)
  loop
    t := search(root, 0, bound)
    if t = FOUND then return FOUND
    if t =  $\infty$  then return NOT_FOUND
    bound := t
  end loop
end procedure
```

```
function search(node, g, bound)
  f := g + h(node)
  if f > bound then return f
  if is_goal(node) then return FOUND
  min :=  $\infty$ 
  for succ in successors(node) do
    t := search(succ, g + cost(node, succ), bound)
    if t = FOUND then return FOUND
    if t < min then min := t
  end for
  return min
end function
```

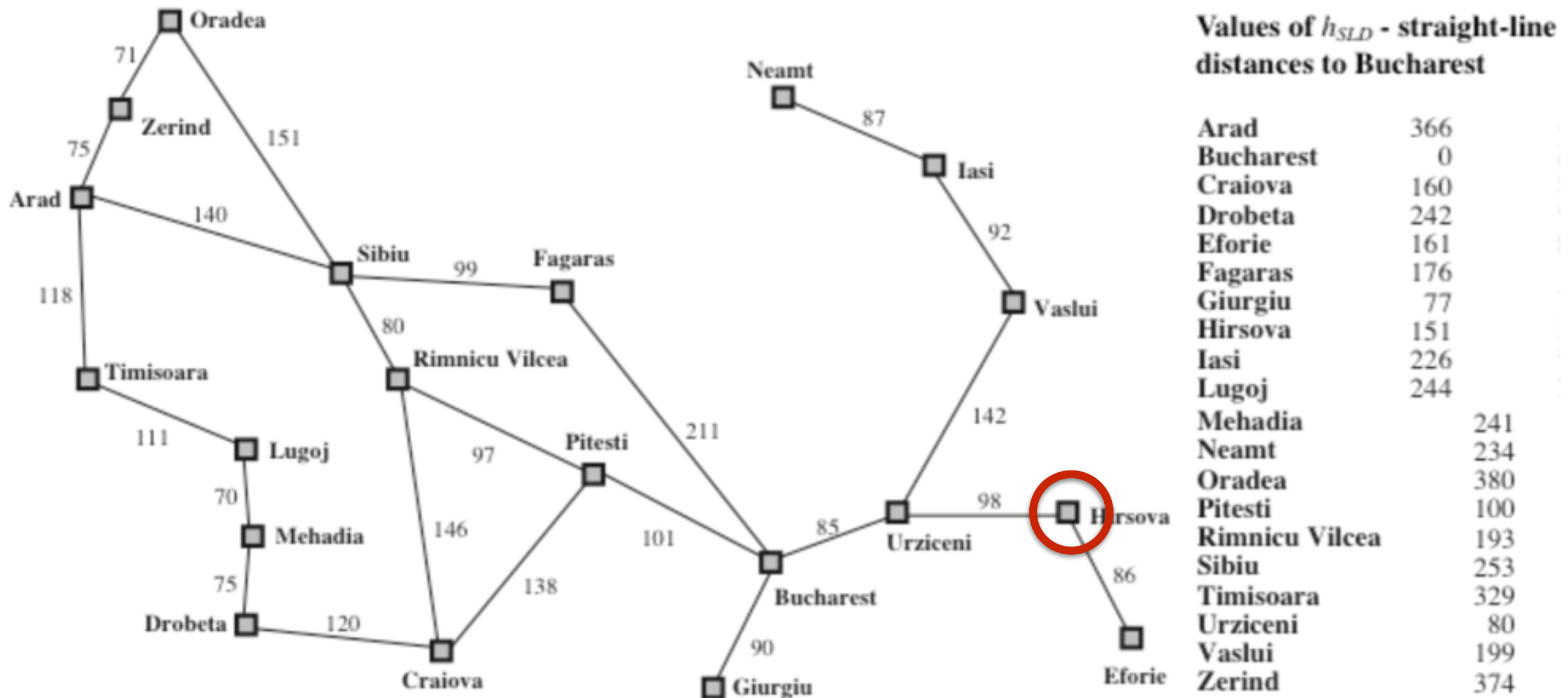
misal : Hirsova -> Bucharest
 $h(\text{Hirsova}) = 151$, bound = 151



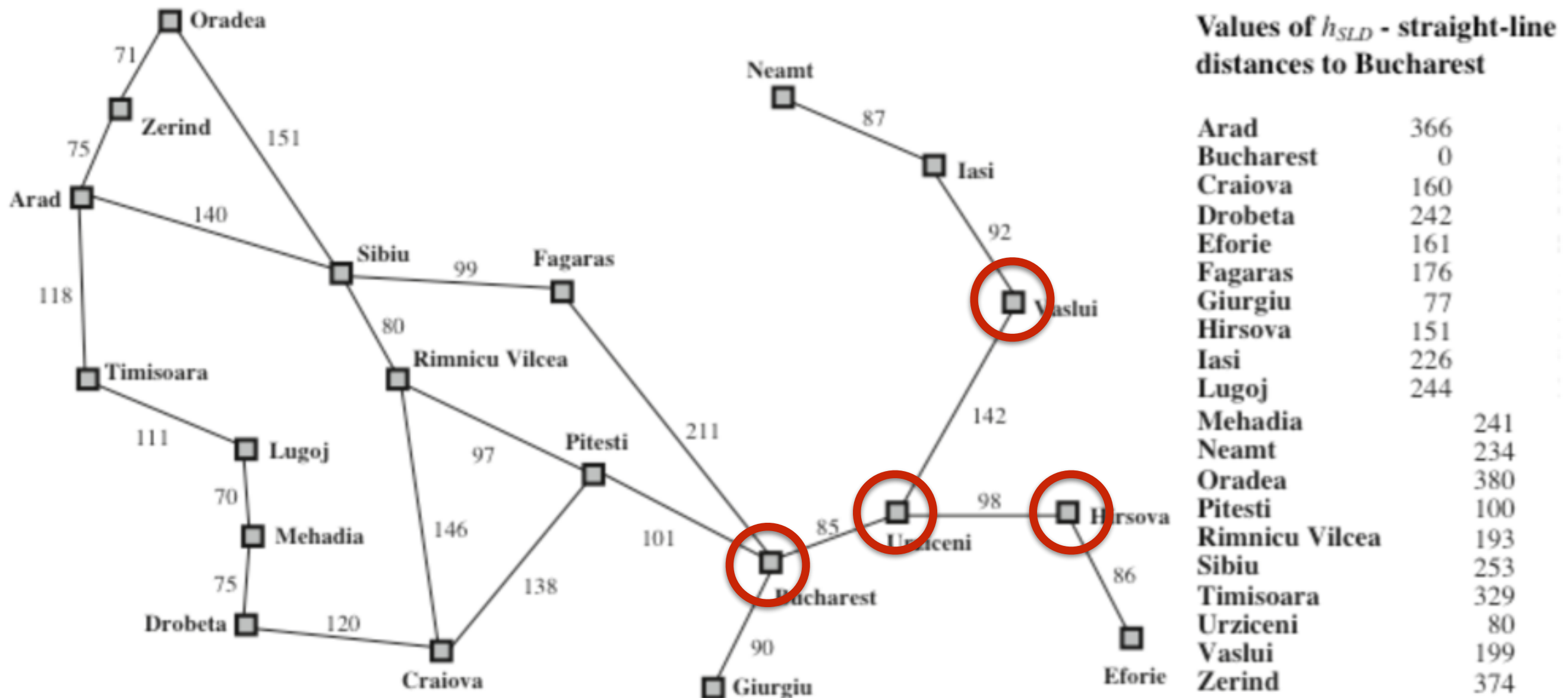
$f(\text{Urziceni}) = 80 + 98 = 178$ - FAIL
 $f(\text{Eforie}) = 161 + 86 = 247$ - FAIL



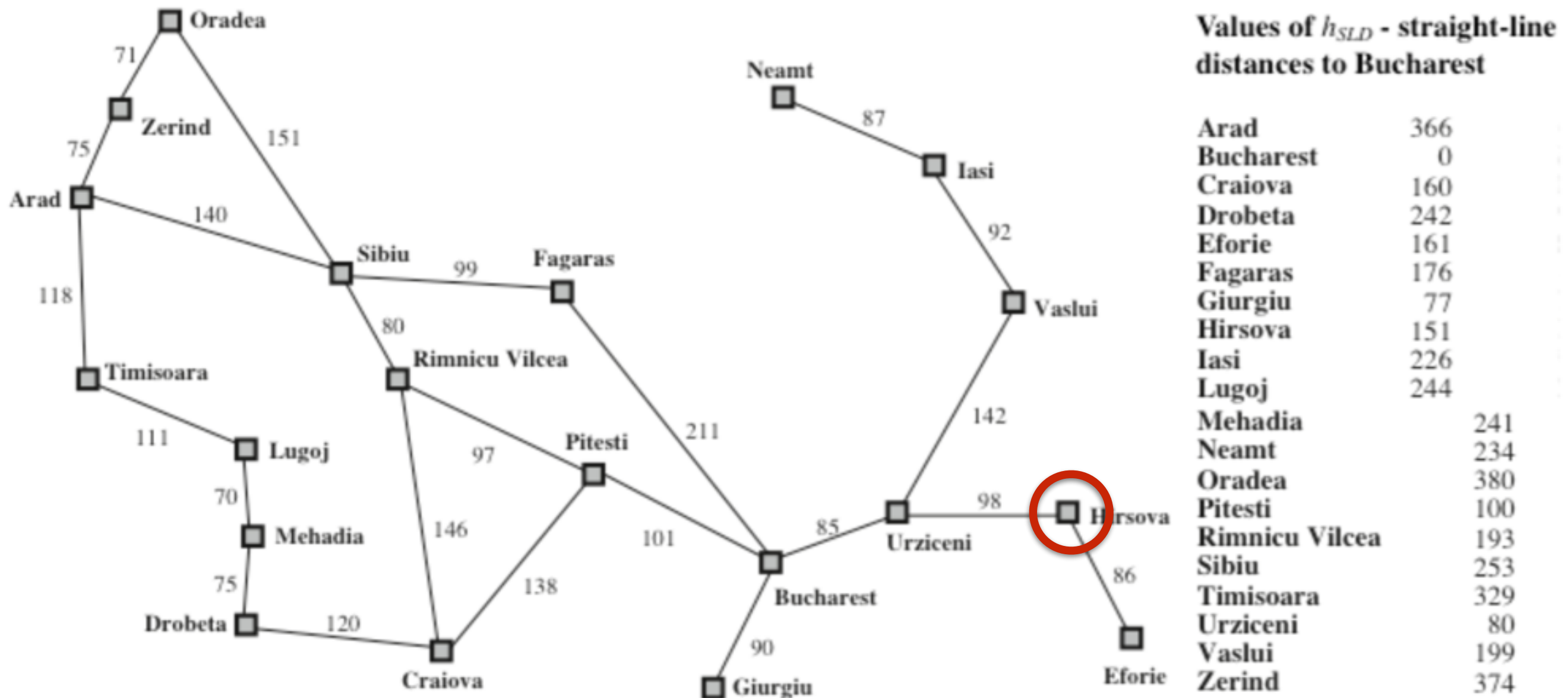
dua2nya fail, bound = 178
ulang dari awal



$f(\text{Bucharest}) = 0 + 85 + 98 = 183$ - FAIL
 $f(\text{Vaslui}) = 199 + 98 + 142 = 439$ - FAIL



bound = 183. ulang dari awal



bound = 183 bakal dapet solusi
return 183



why IDA*?

EOF

Q&A?