

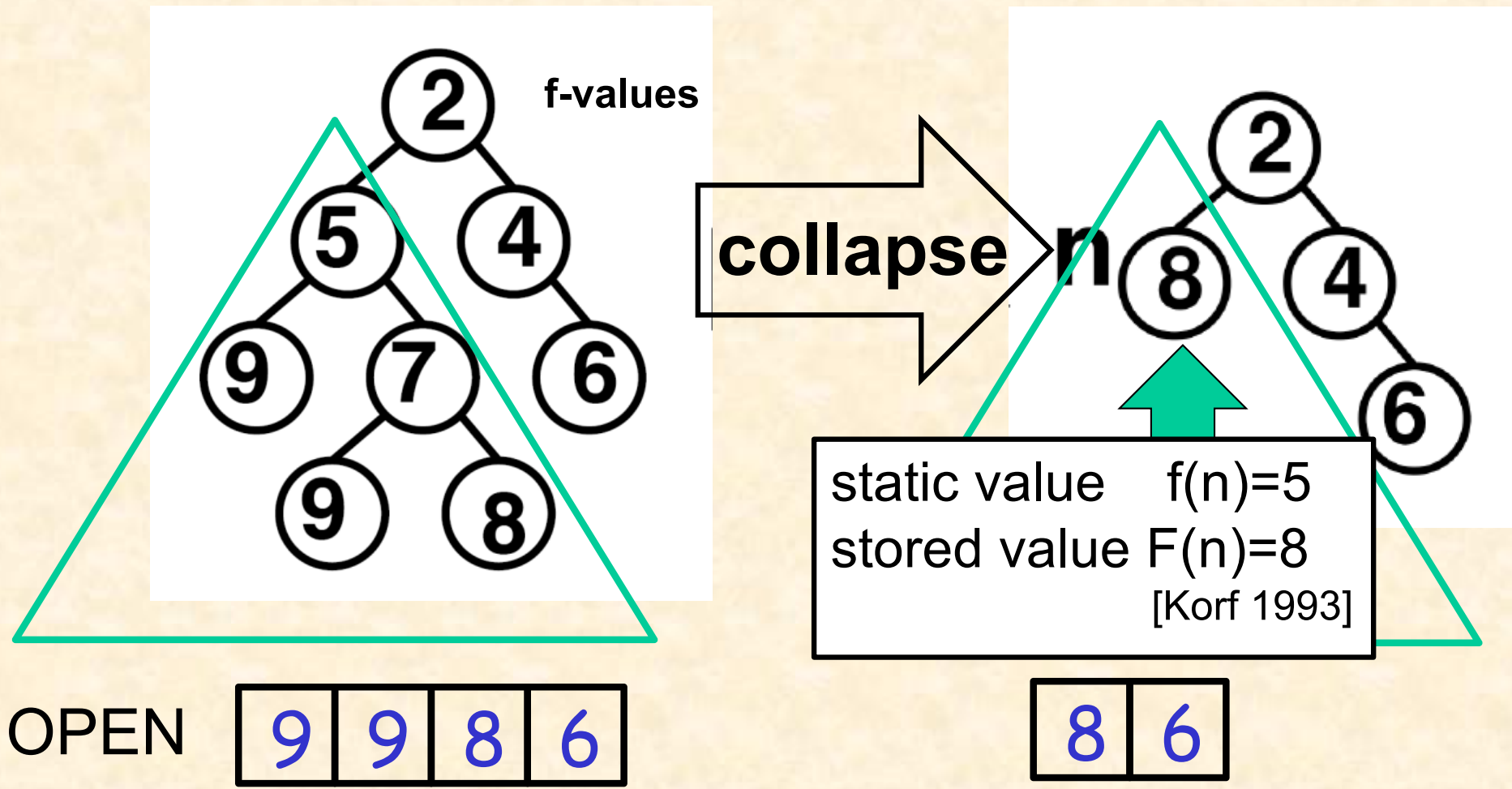
**Search for Optimal Solutions:
the Heart of Heuristic Search is Still Beating**

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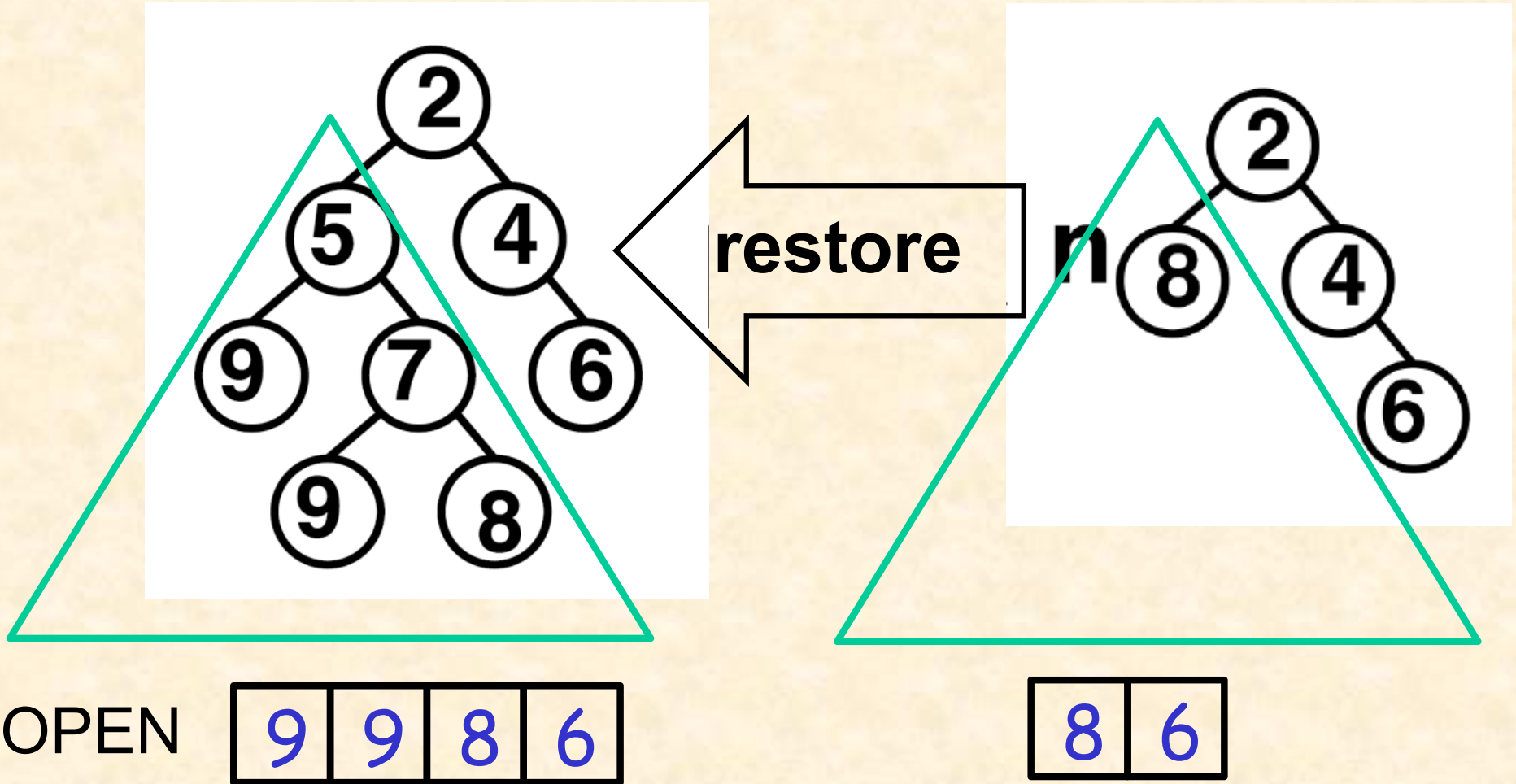
2. Collapse and Restore macros

[#1, SoCS-2015]

2.1 Collapse macro for best-first search



Restore macro

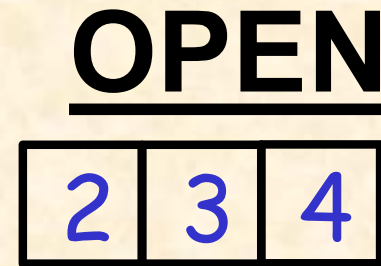
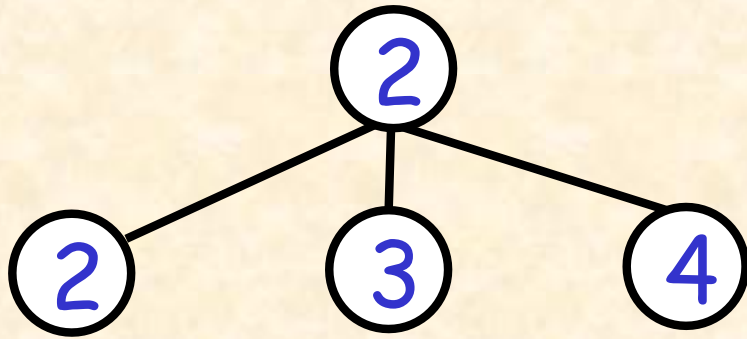


- Collapse is a **lossy** compression
 - 1) How do we know a node was collapsed?
 - 2) How do we restore?

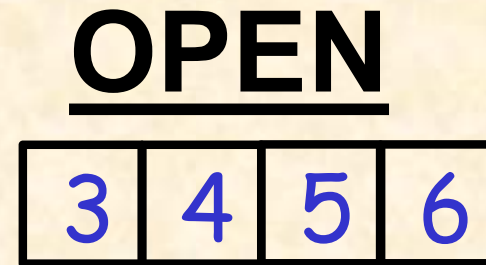
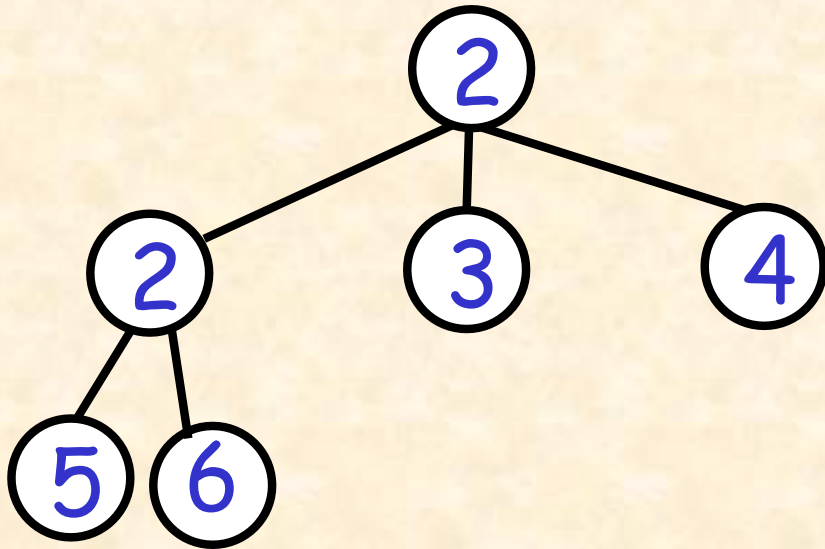
Restore is algorithm dependent

If $F(n) > f(n)$ and the f -value is monotonically increasing just perform a bounded DFS by $F(N)$. [Korf 1993]

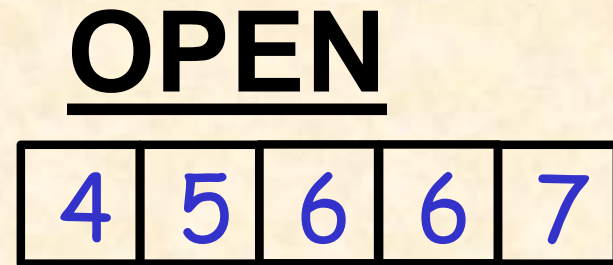
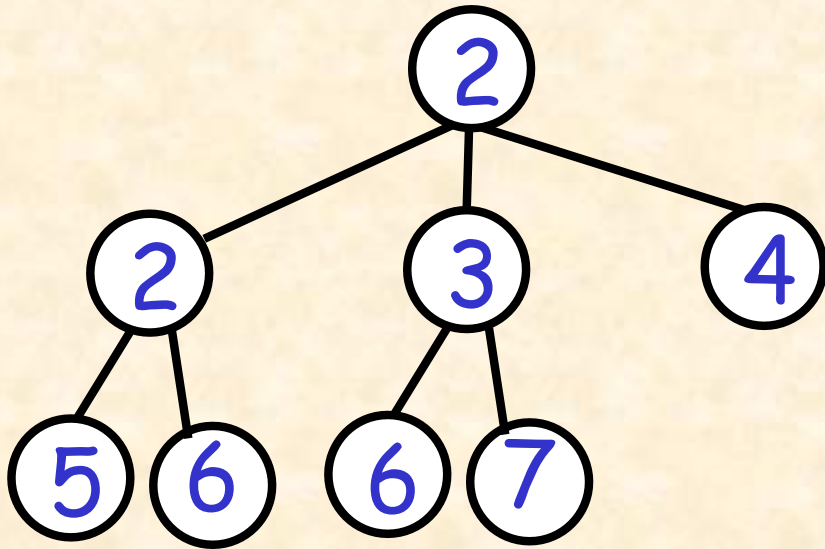
2.2 SMA* [#2:Russell 1992]



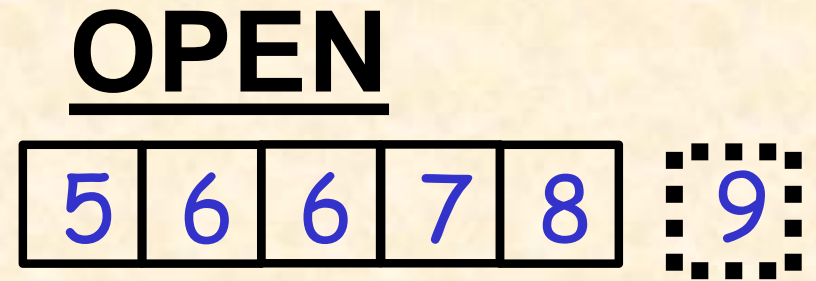
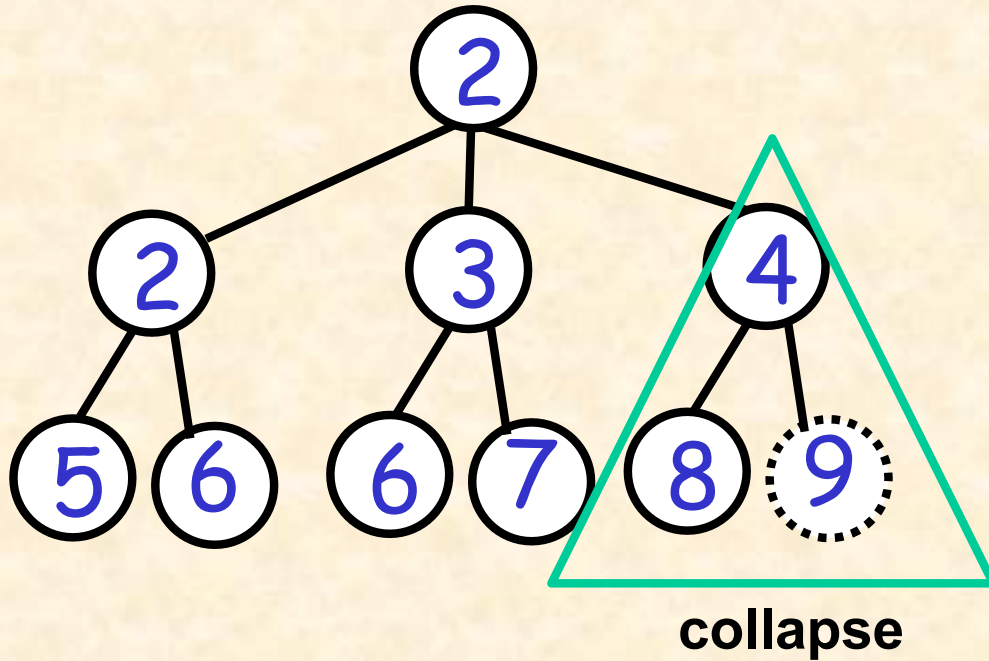
SMA* [Russell 1992]



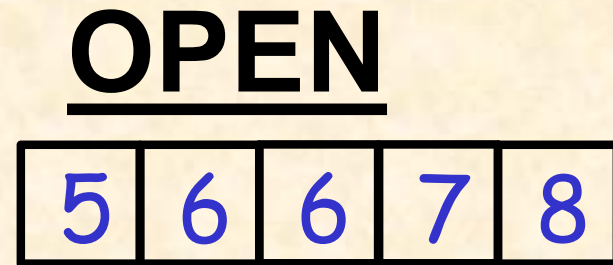
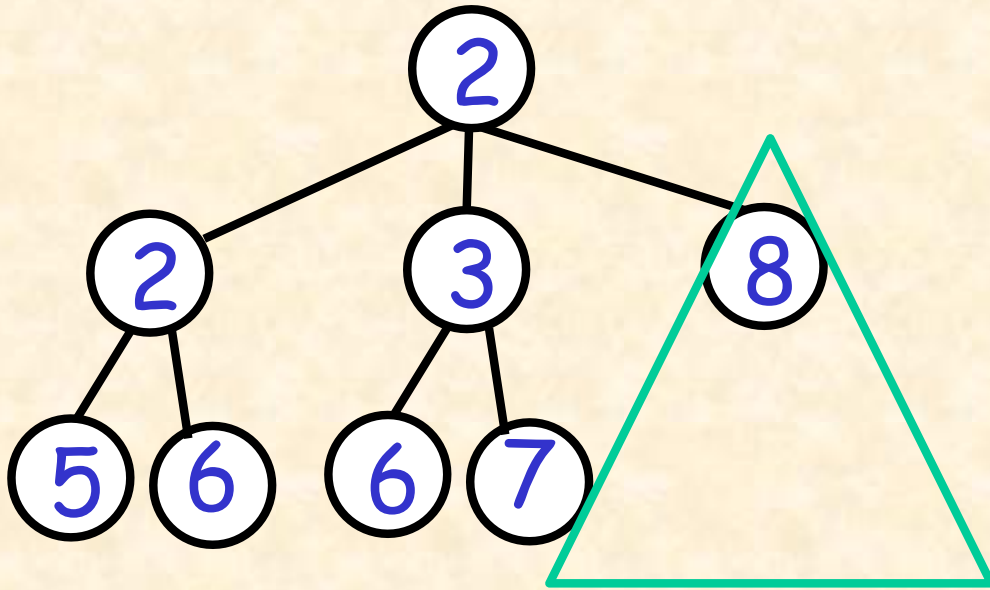
SMA* [Russell 1992]



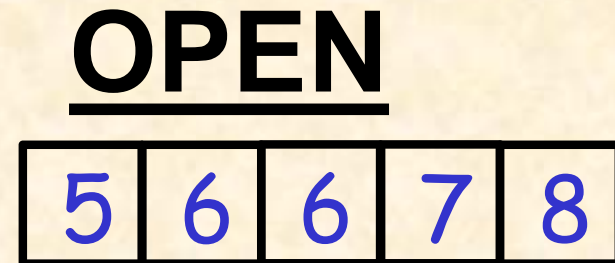
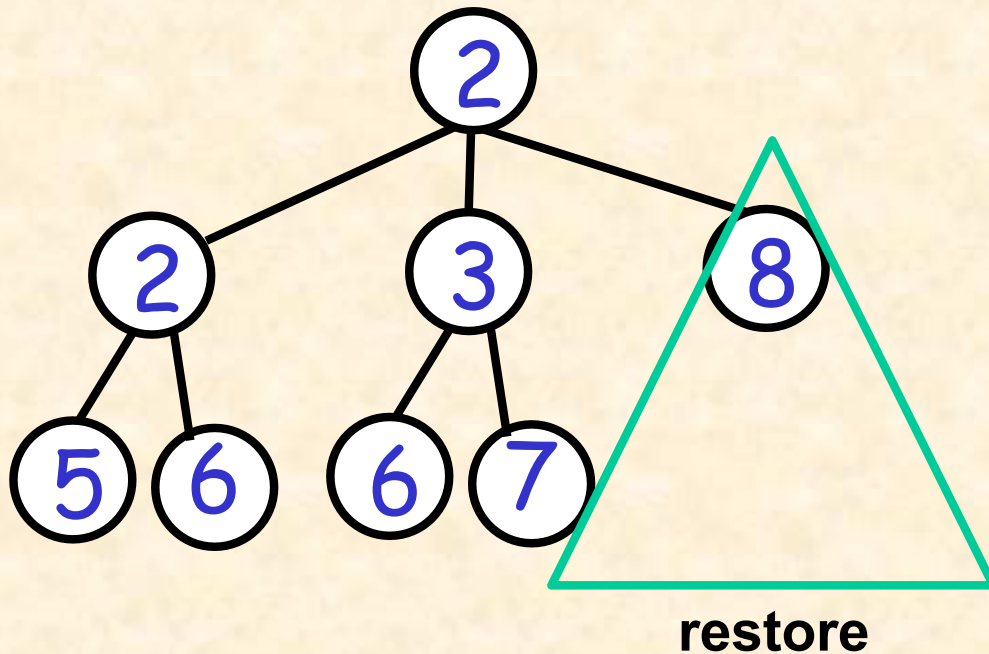
SMA* [Russell 1992]



SMA* [Russell 1992]



SMA* [Russell 1992]



SMA* uses a variant of pathmax for its restore macro

2.3. ILBFS [#1 SoCS-2015]

Iterative linear best-first search

Iterative variant of RBFS [Korf, AIJ 1993]

Algorithm 1: High-level ILBFS

Input: Root R

1 Insert R into OPEN and TREE

2 $oldbest = NULL$

3 **while** $OPEN$ not empty **do**

4 $best = extract_min(OPEN)$

5 **if** $goal(best)$ **then**

6 exit

Collapse

Restore

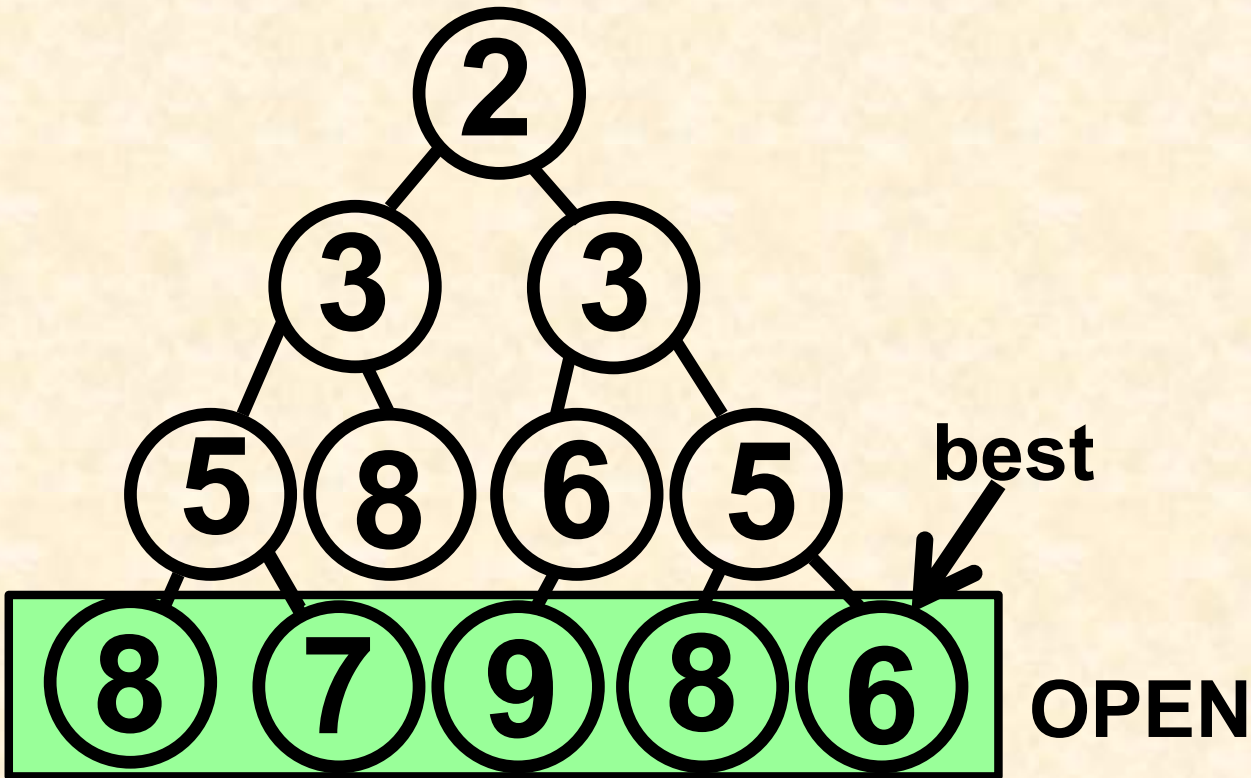
12 **foreach** $child\ C\ of\ best$ **do**

13 Insert C to OPEN and TREE

14 $oldbest \leftarrow best$

-
- Uses the regular BFS expansion cycle
 - Heavily uses the collapse and restore macros

ILBFS

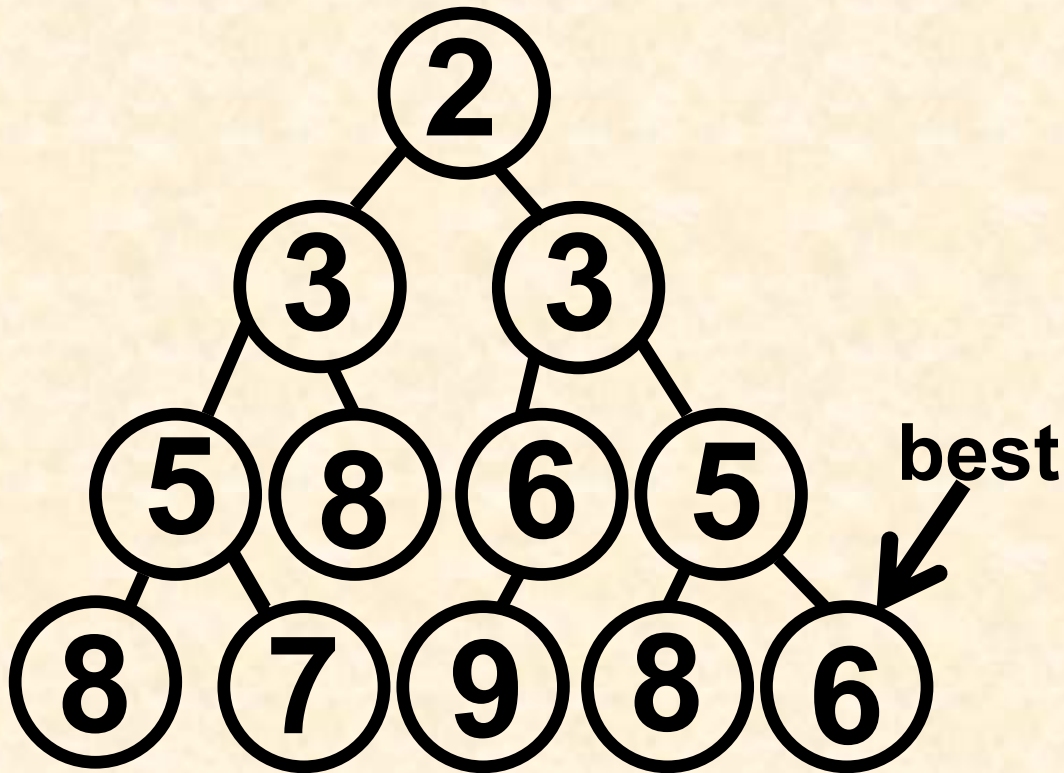


Classic BFS

Principal branch invariant

Store only the branch of the best node and its siblings

ILBFS



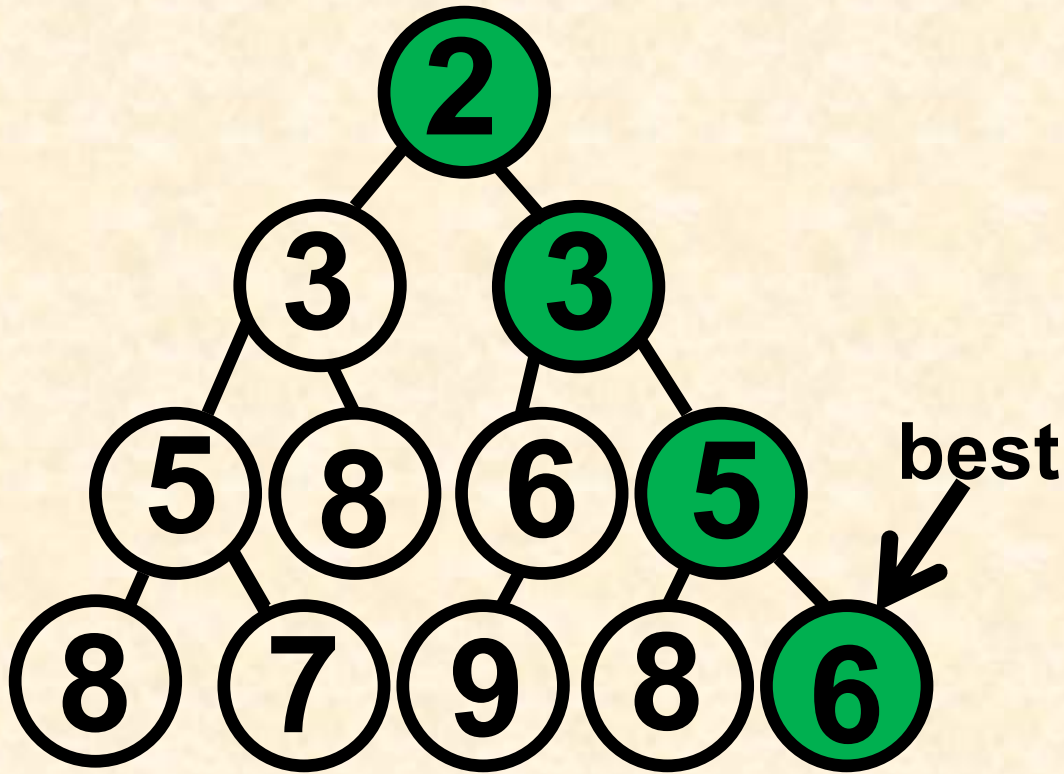
Classic BFS

Principal branch invariant

Store only the branch of the best node and its siblings

branch

ILBFS

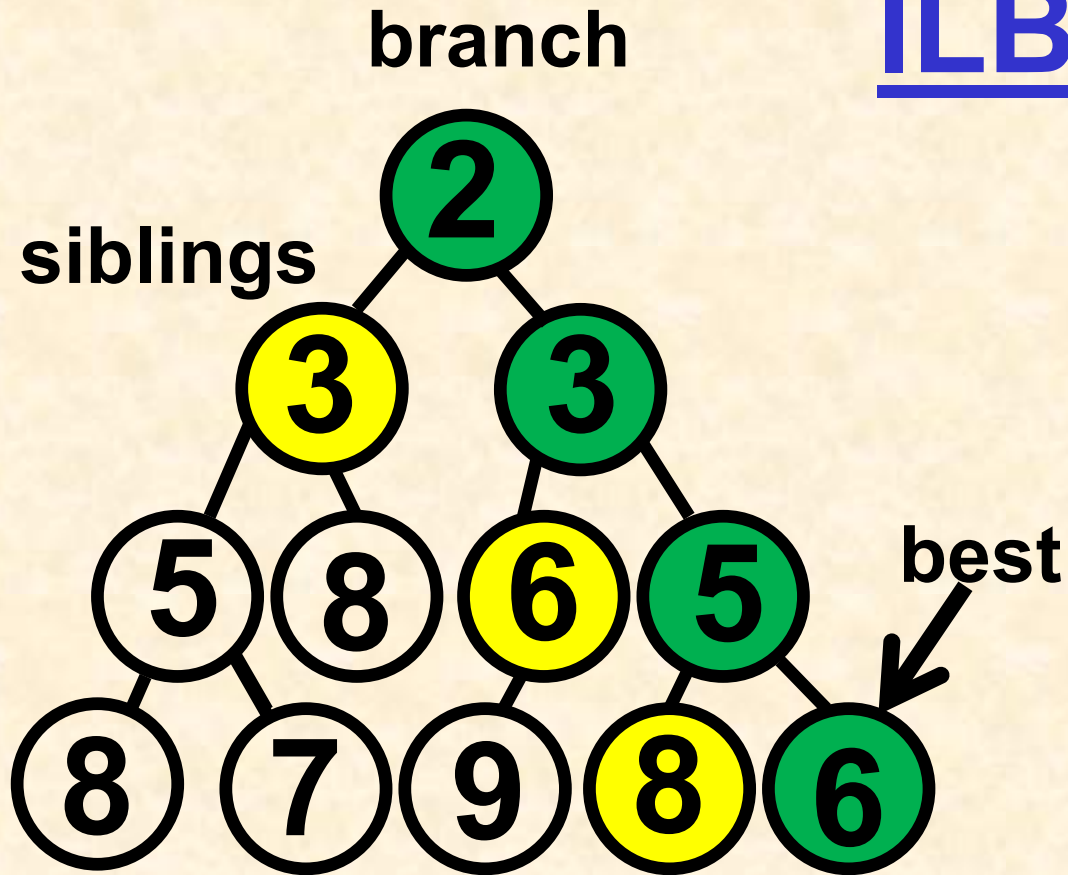


Classic BFS

Principal branch invariant

Store only the branch of the best node and its siblings

ILBFS

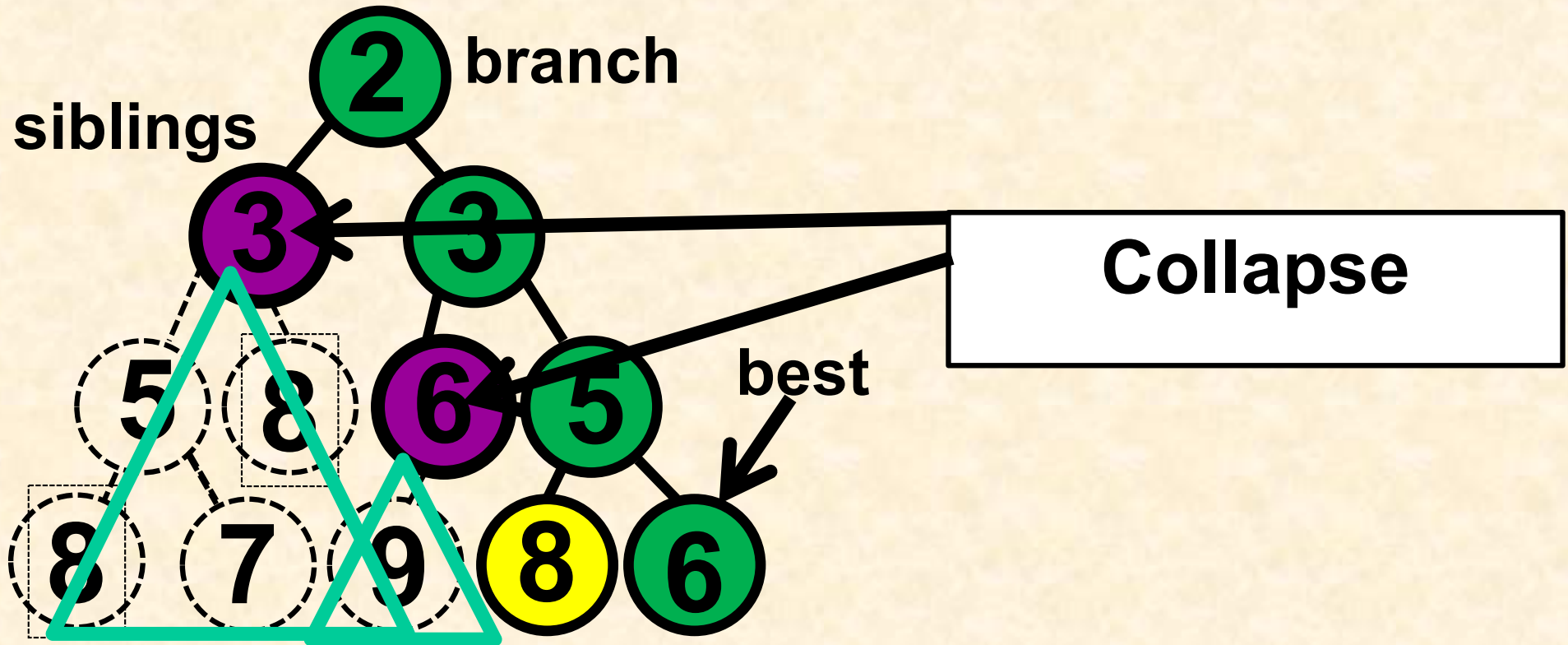


Classic BFS

Principal branch invariant

Store only the branch of the best node and its siblings

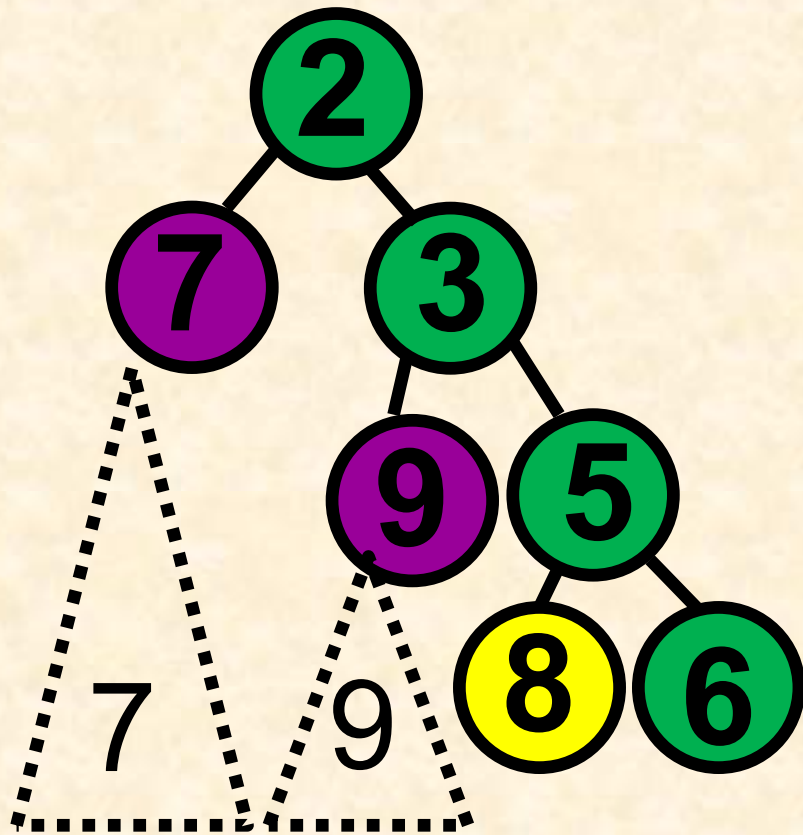
ILBFS



Principal branch invariant

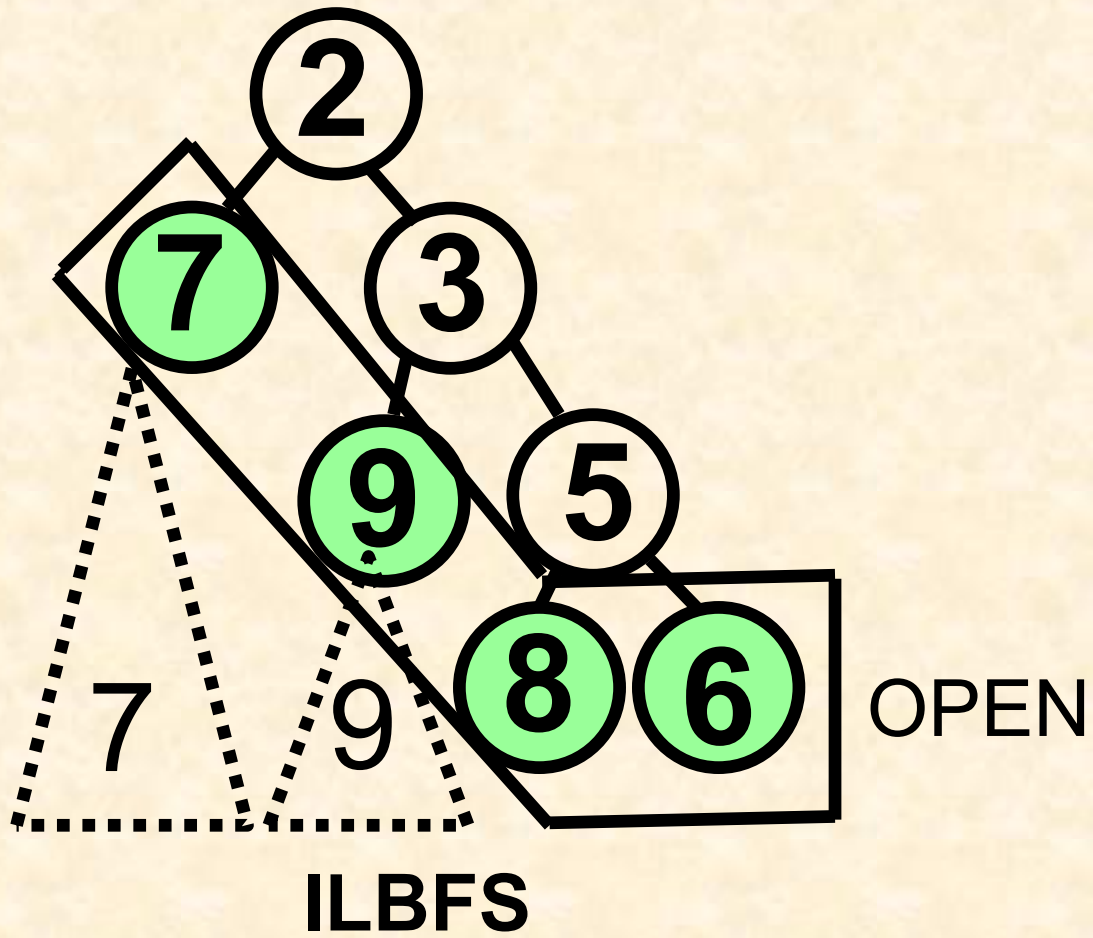
Store only the branch of the best node and its siblings

ILBFS

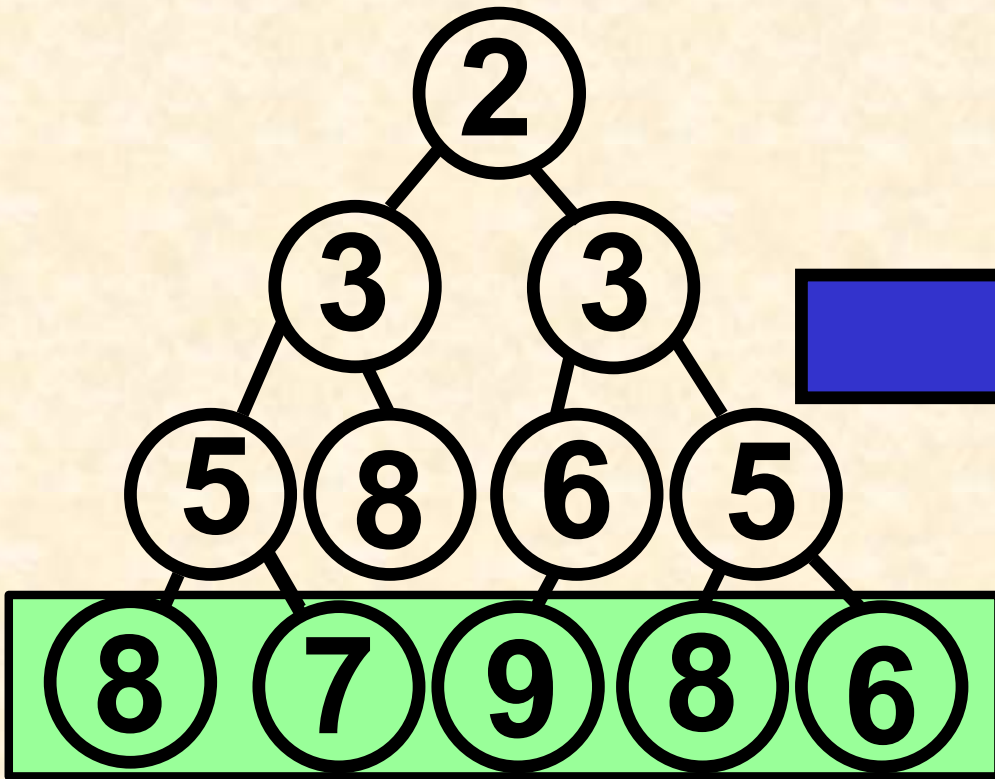


ILBFS

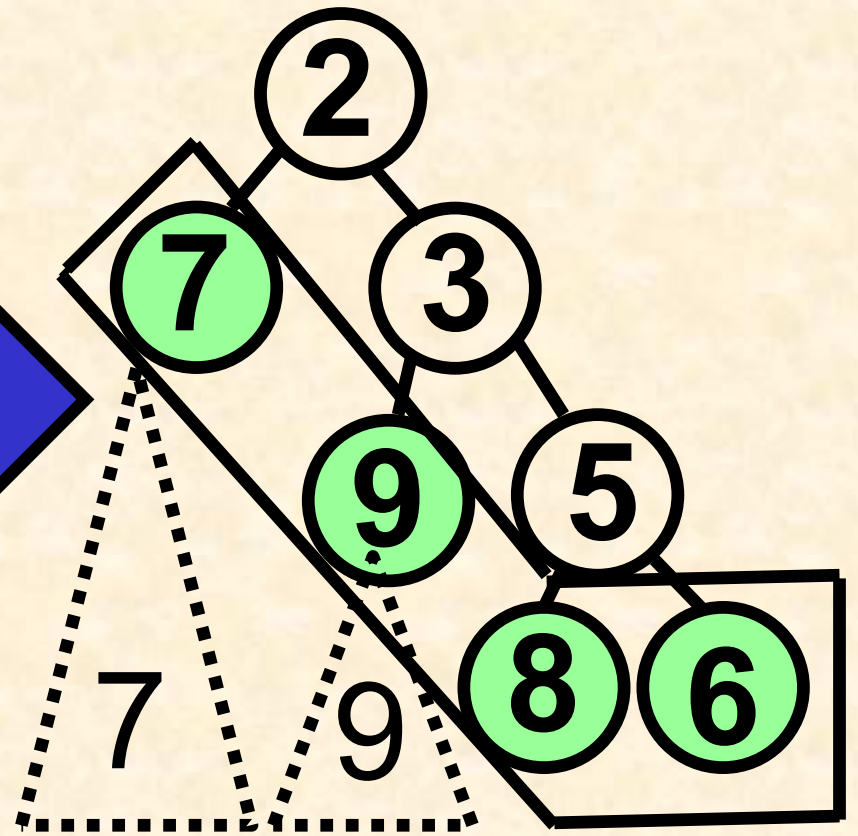
ILBFS



ILBFS



(a) classic BFS

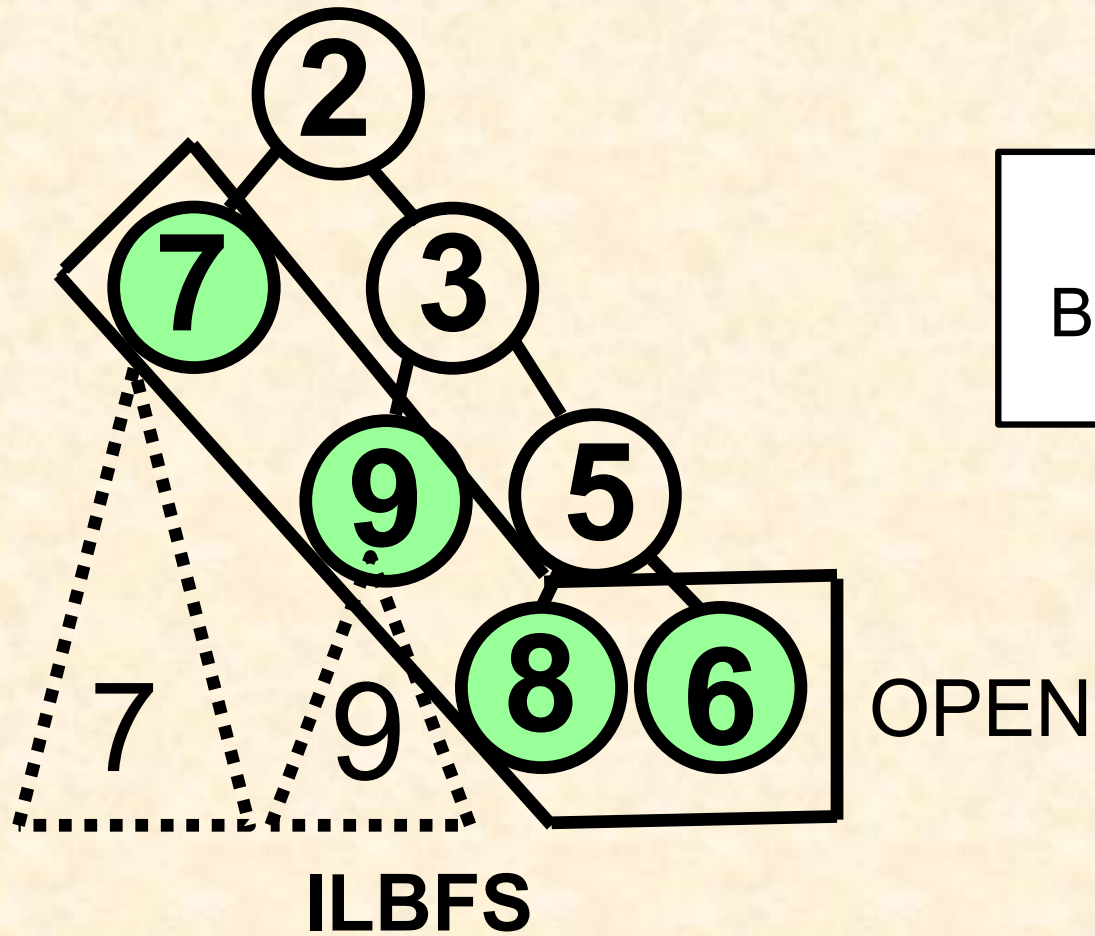


ILBFS

Principal branch invariant

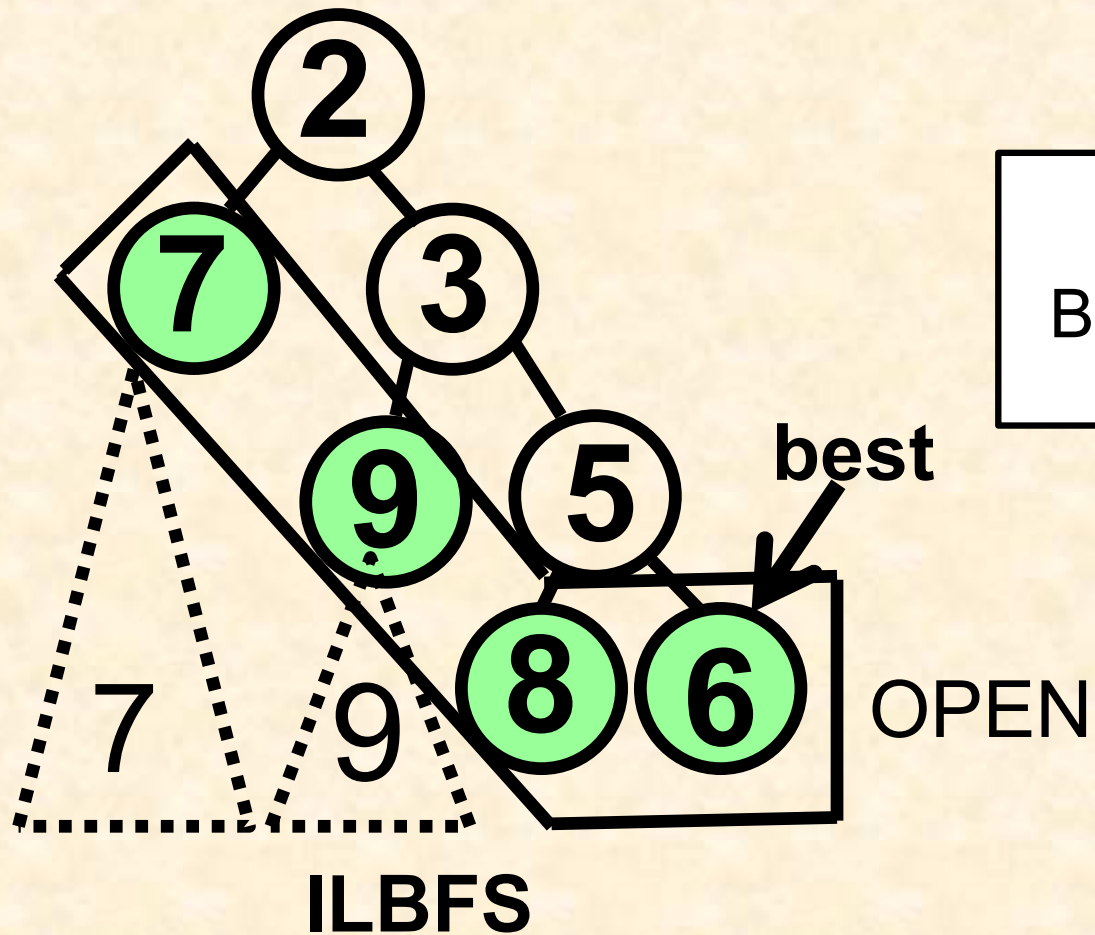
- Initially valid for the root
- Two cases for the expansion cycle.

ILBFS



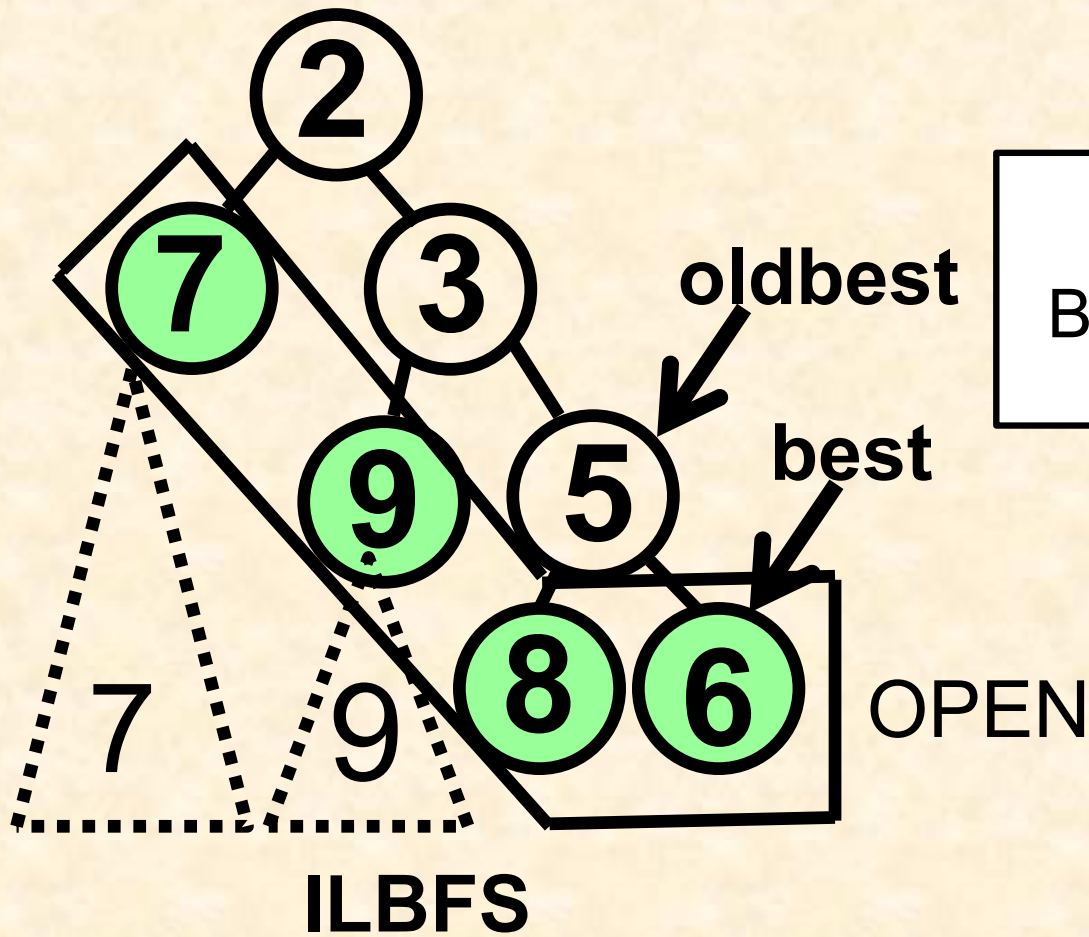
Case 1:
Best is a child of oldbest

ILBFS



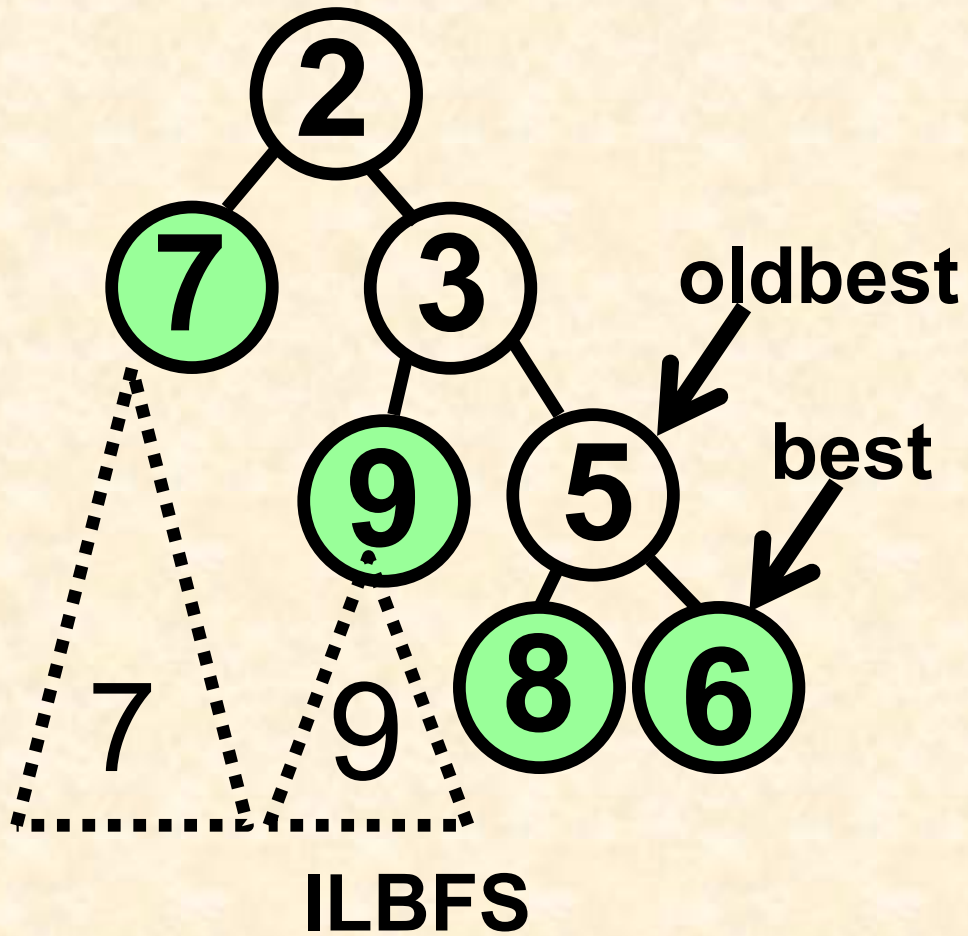
Case 1:
Best is a child of oldbest

ILBFS



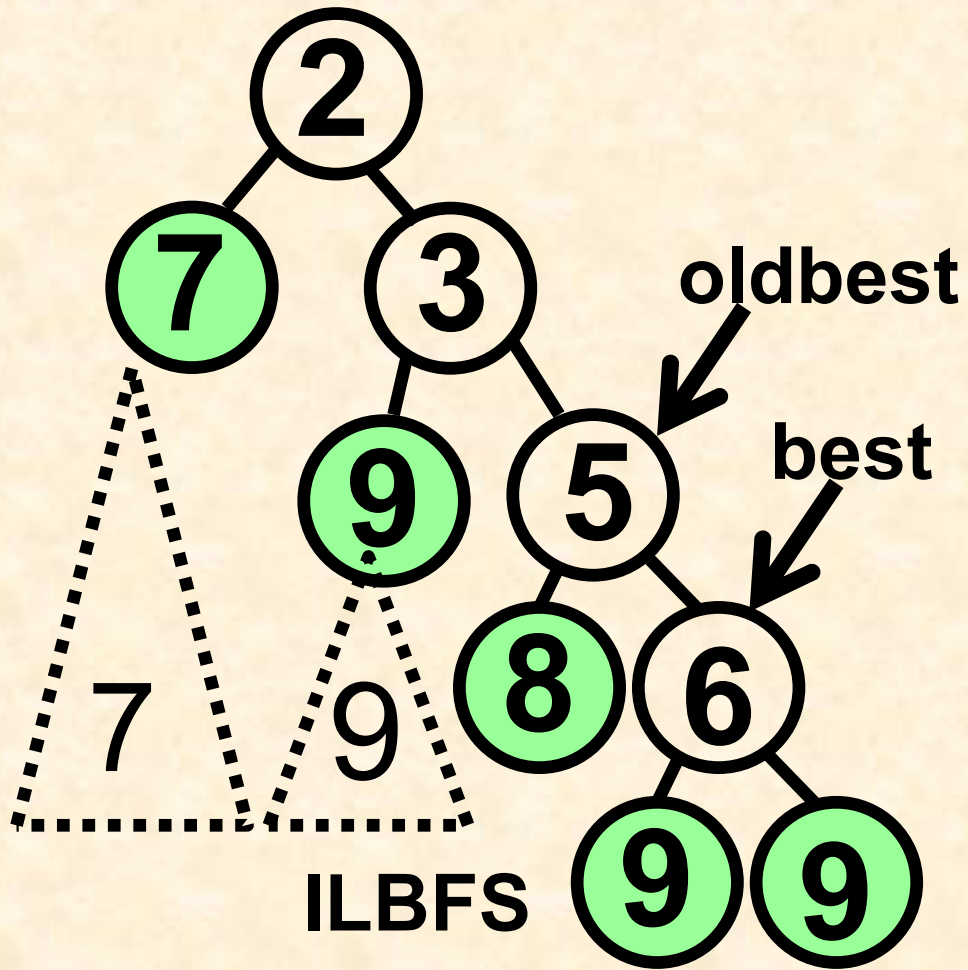
Case 1:
Best is a child of oldbest

ILBFS



Case 1:
Best is a child of oldbest

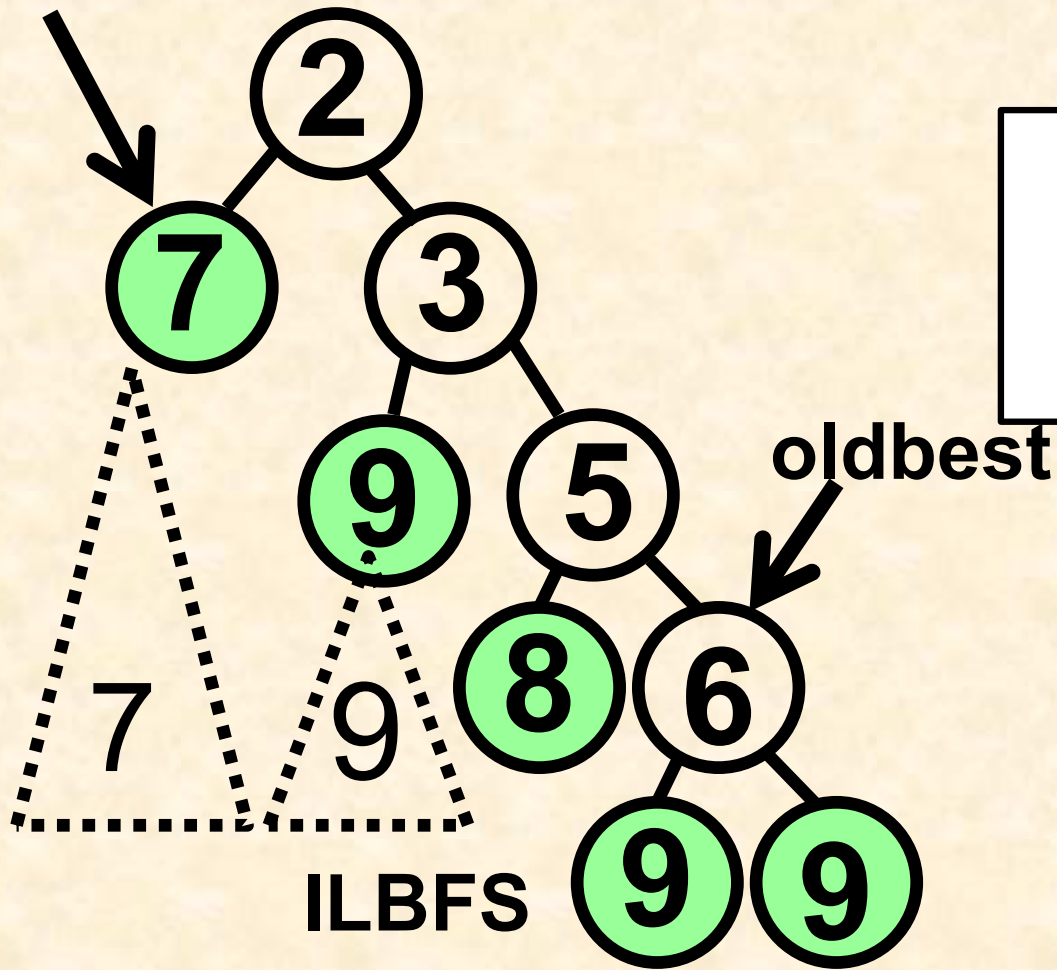
ILBFS



Case 1:
Best is a child of oldbest

ILBFS

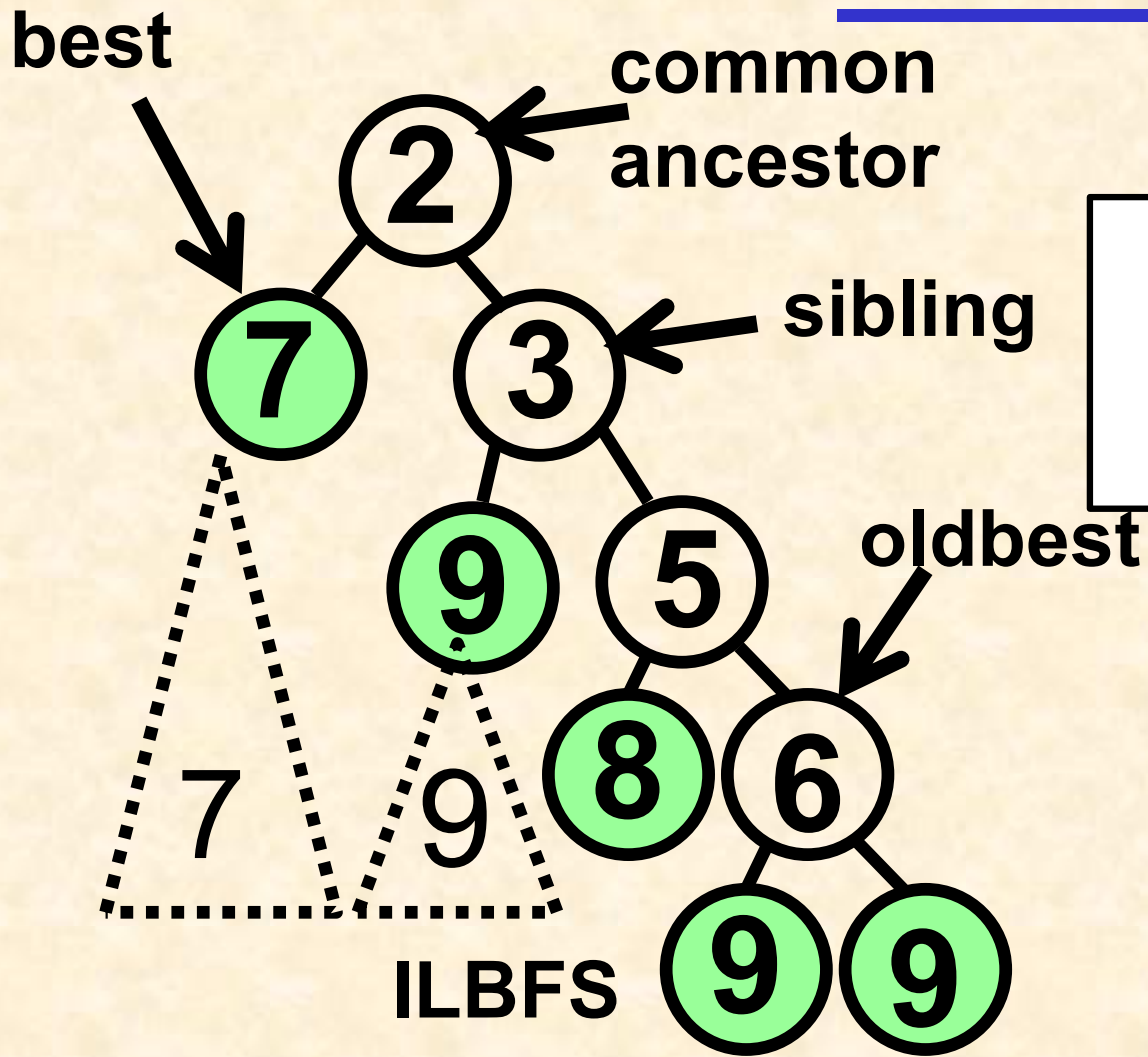
best



Case 2:

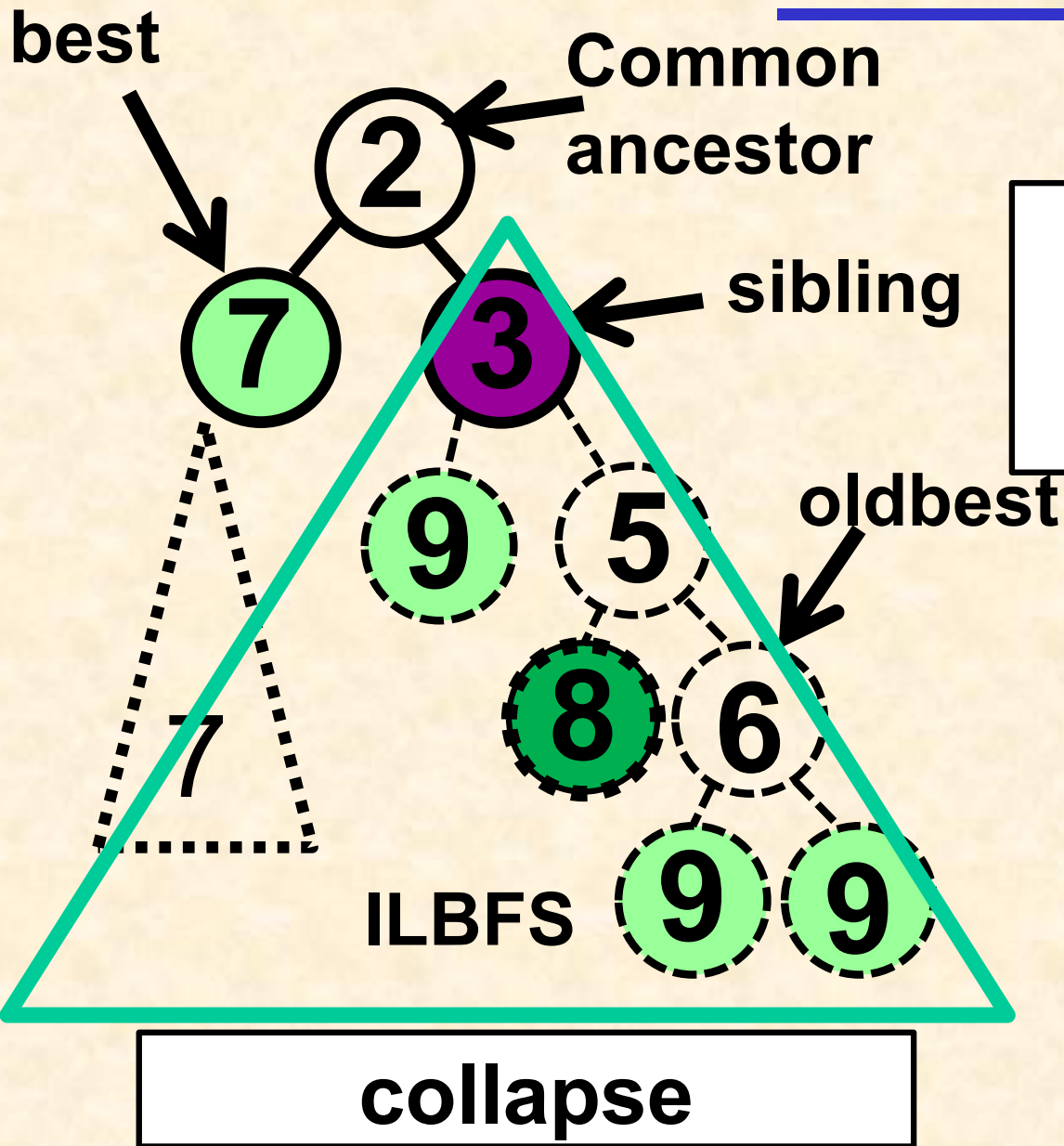
Best is not a
child of oldbest

ILBFS



Case 2:
Best is not a
child of oldbest

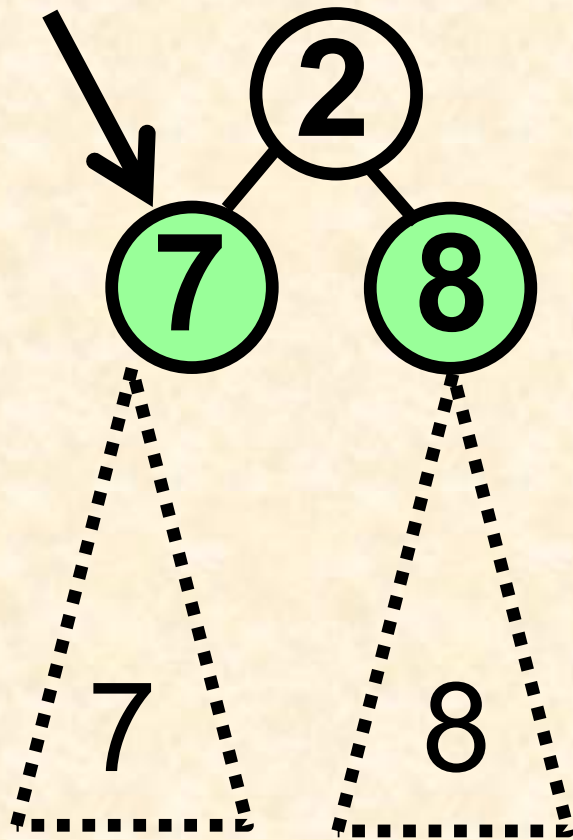
ILBFS



Case 2:
Best is not a
child of oldbest

ILBFS

best

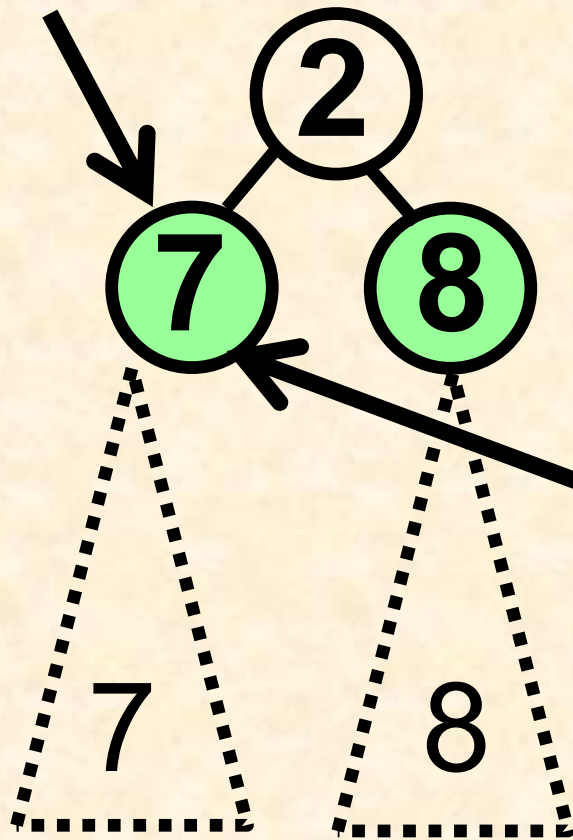


Case 2:

Best is not a
child of oldbest

ILBFS

best



Case 2:

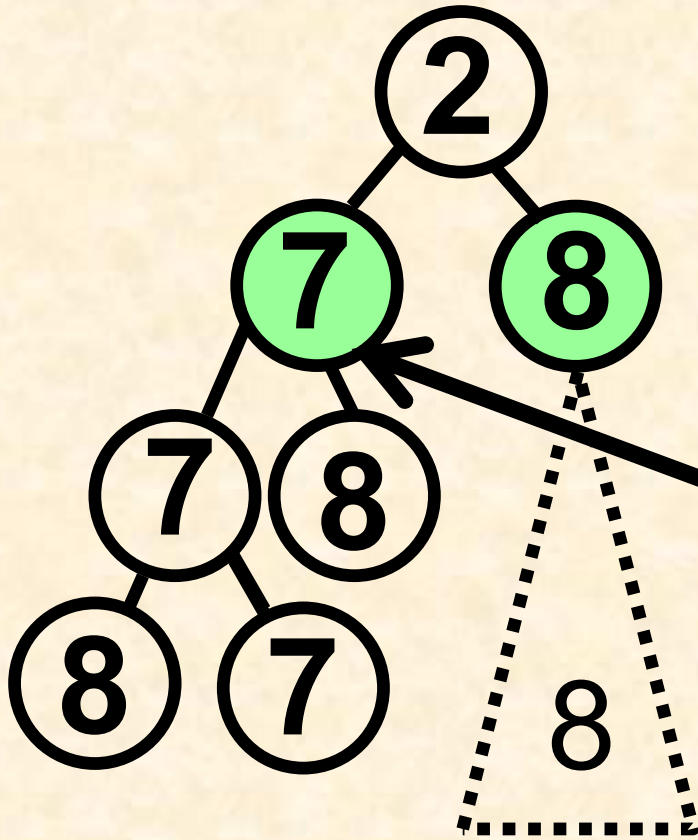
Best is a collapsed node

Restore

$f=3, F=7$

DFS(7)

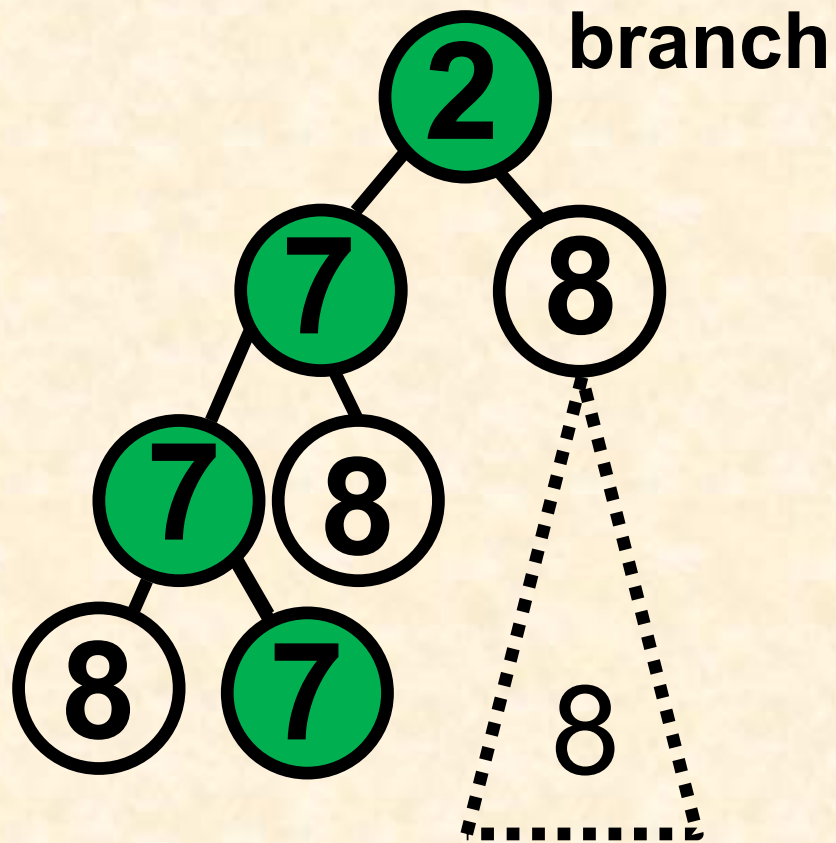
ILBFS



Case 2:
Best is a collapsed node

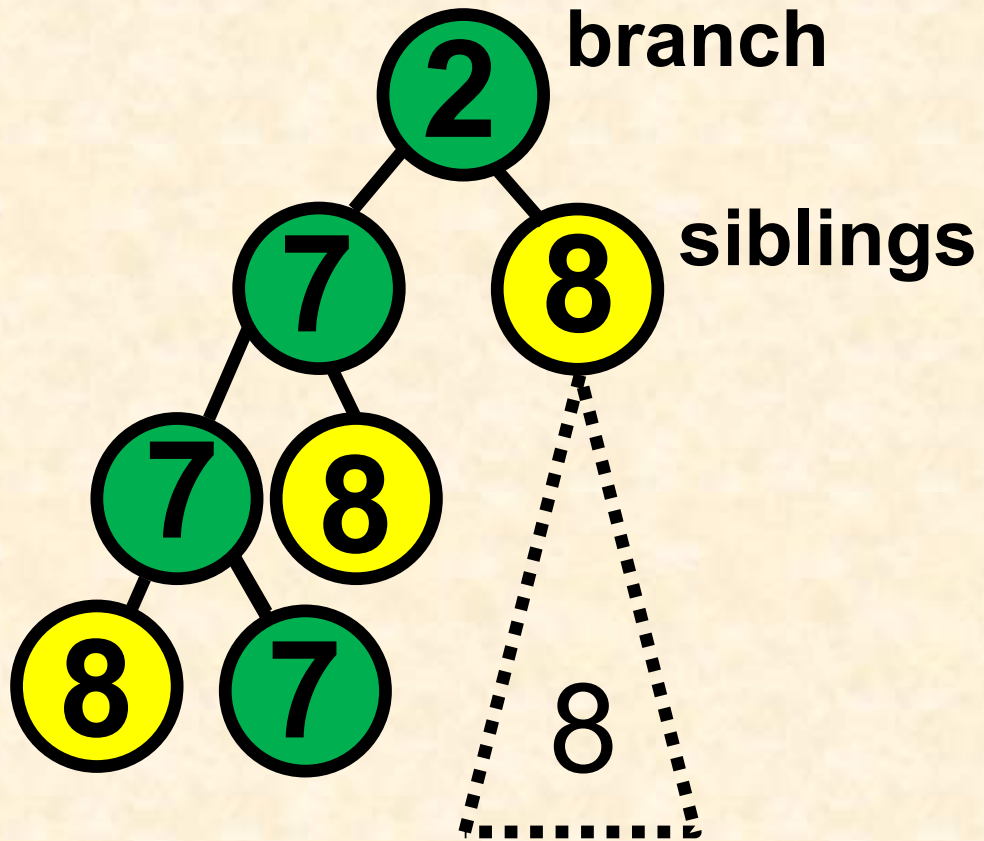
Restore
f=3, F=7
DFS(7)

ILBFS



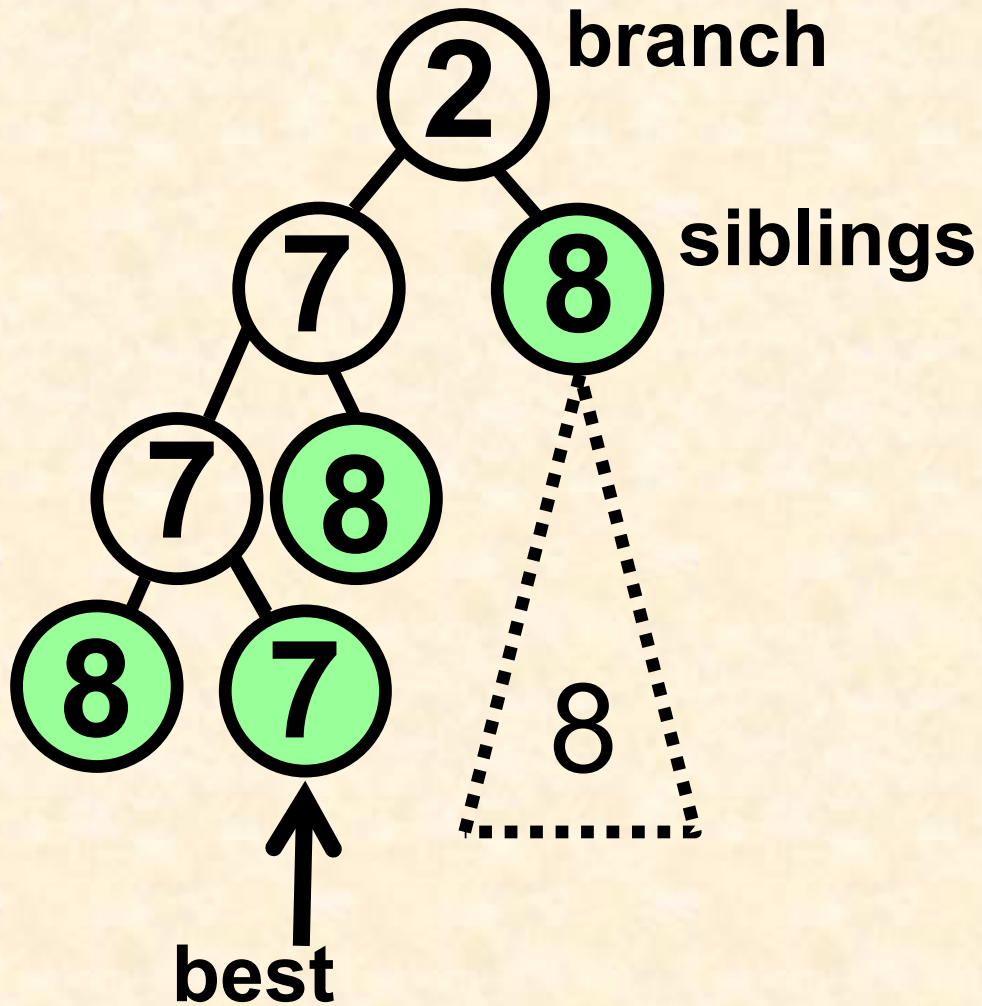
Case 2:
Best is a collapsed node

ILBFS



Case 2:
Best is a collapsed node

ILBFS



Case 2:
Best is a collapsed node

Restore in ILBFS

- Restore is the only non-trivial step of ILBFS (and RBFS too)
- Observation: After collapse $F(n) > f(n)$
- Restore: DFS below n bounded by $F(n)$

Linear-space best-first search

Iterative variant - ILBFS

Algorithm 1: High-level ILBFS

```
Input: Root  $R$ 
1 Insert  $R$  into OPEN and TREE
2  $oldbest = \text{NULL}$ 
3 while OPEN not empty do
4    $best = \text{extract\_min}(\text{OPEN})$ 
5   if  $\text{goal}(best)$  then
6      $\text{exit}$ 
7   if  $oldbest \neq best.parent$  then
8      $B \leftarrow$  sibling of  $oldbest$  that is ancestor of  $best$ 
9      $\text{collapse}(B)$ 
10  if  $best.C = \text{True}$  then
11     $best \leftarrow \text{restore}(best)$ 
12  foreach child  $C$  of  $best$  do
13    Insert  $C$  to OPEN and TREE
14   $oldbest \leftarrow best$ 
```

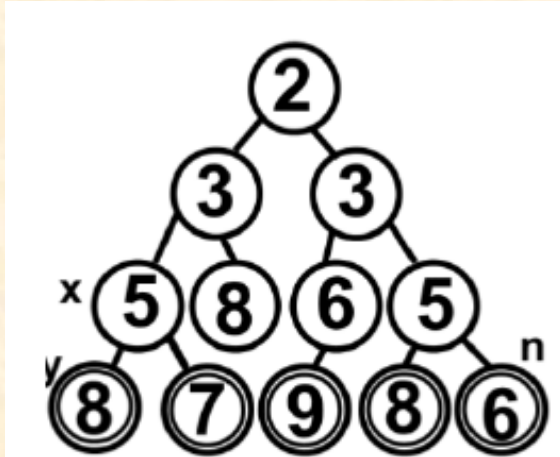
Recursive variant - RBFS

RBFS(n, B)

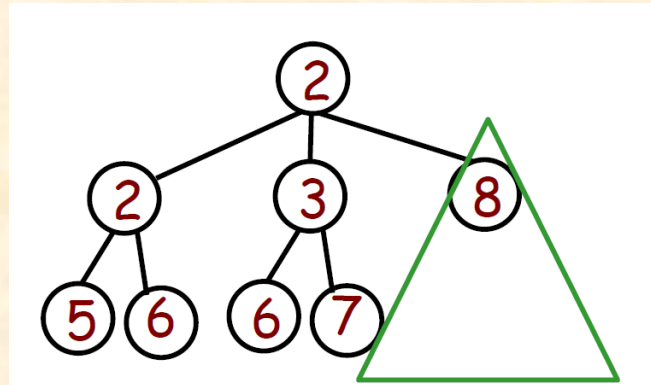
1. if n is a goal
2. $solution \leftarrow n$; $\text{exit}()$
3. $C \leftarrow \text{expand}(n)$
4. if C is empty, return ∞
5. for each child n_i in C
6. if $f(n) < F(n)$ then $F(n_i) \leftarrow \max(F(n), f(n_i))$
7. else $F(n_i) \leftarrow f(n_i)$
8. $(n_1, n_2) \leftarrow \text{best}_F(C)$
9. while $(F(n_1) \leq B$ and $F(n_1) < \infty)$
10. $F(n_1) \leftarrow \text{RBFS}(n_1, \min(B, F(n_2)))$
11. $(n_1, n_2) \leftarrow \text{best}_F(C)$
12. return $F(n_1)$

ILBFS – an iterative variant of RBFS [Korf 1993]

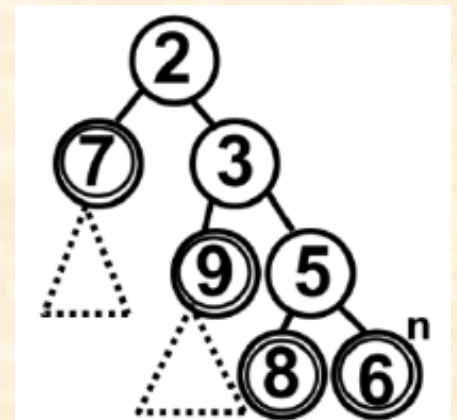
A*



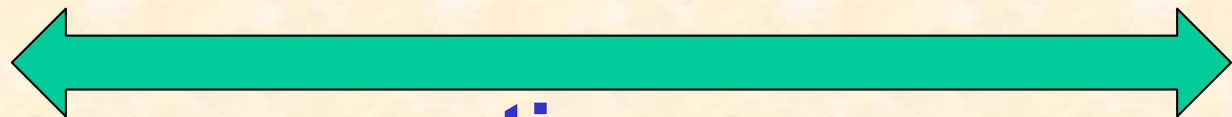
SMA*



RBFS/ILBFS



memory	b^d	M	$O(d)$
collapse	never	lazily	eagerly



continuum