# Verifying Lock-free Search Structure Templates

Nisarg Patel (with Dennis Shasha and Thomas Wies)



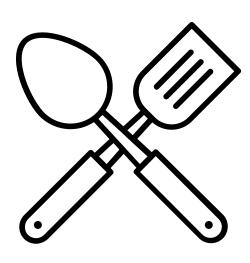
## Recipe for modular verification



Step 1:

Find a class of structures with common correctness reasoning

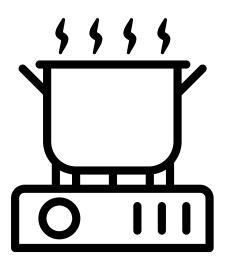
- PLDI20 : (Lock-based, single copy) B-trees, Hash-tables, linked lists
- OOPSLA21: (Lock-based, multicopy) Log-Structured Merge (LSM) Trees



Step 2:

Develop enabling technology

- Template Algorithms
- Edgeset Framework
- Flow Framework



Step 3:

Formalize the proof

- Resource Algebras
- Supports proof modularity



- Siddharth Krishna et al. *Verifying concurrent search structure templates*. [PLDI 2020]
- Nisarg Patel et al. *Verifying concurrent multicopy search structures*. [OOPSLA 2021]

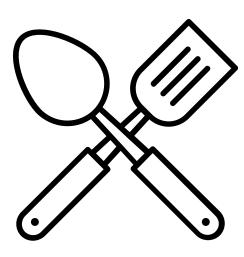
### Outline



Step 1:

Find a class of structures with common correctness reasoning

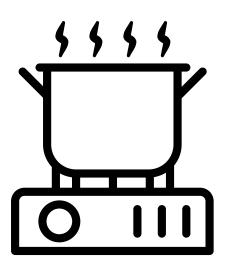
• ECOOP24: (Lock-free) linked lists and skiplists



Step 2:

Develop enabling technology

- Template Algorithms
- Hindsight Framework



Step 3:

Formalize the proof

Evaluation

• Nisarg Patel, Dennis E. Shasha and Thomas Wies. Verifying lock-free search structure templates. [ECOOP 2024]

## Outline



Step 1:

Find a class of structures with common correctness reasoning

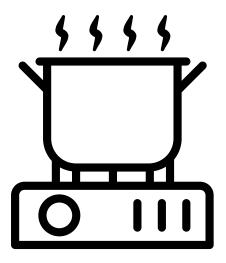
• ECOOP24: (Lock-free) linked lists and skiplists



Step 2:

Develop enabling technology

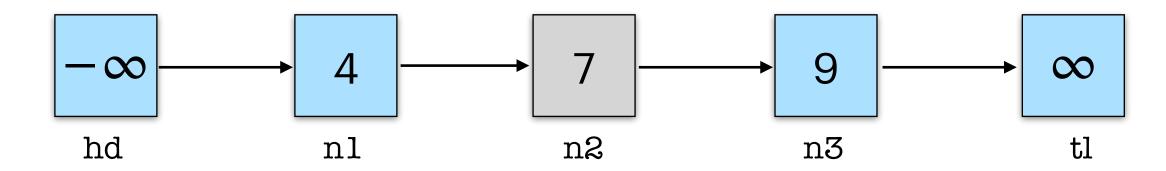
- Template Algorithms
- Hindsight Framework



Step 3:

Formalize the proof

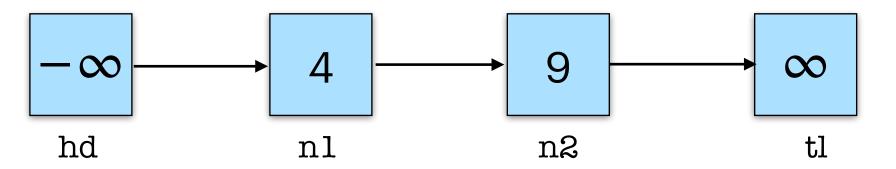
Evaluation



```
insert(k) =
   p, c, res = find(k);
   if res then false
   else
        n = new_node(k, c);
        if CAS(p.next, (c, 0), (n, 0))
        then true else insert(k)
```

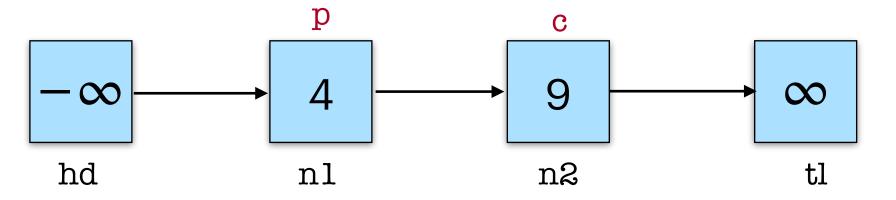
insert(7)

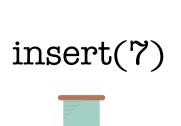


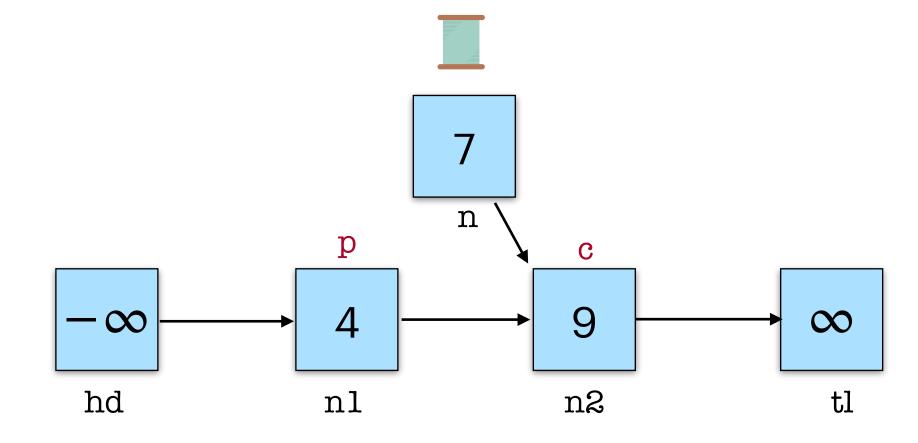


```
insert(k) =
    p, c, res = find(k);
    if res then false
    else
        n = new_node(k, c);
        if CAS(p.next, (c, 0), (n, 0))
        then true else insert(k)
```

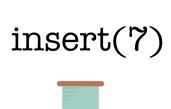


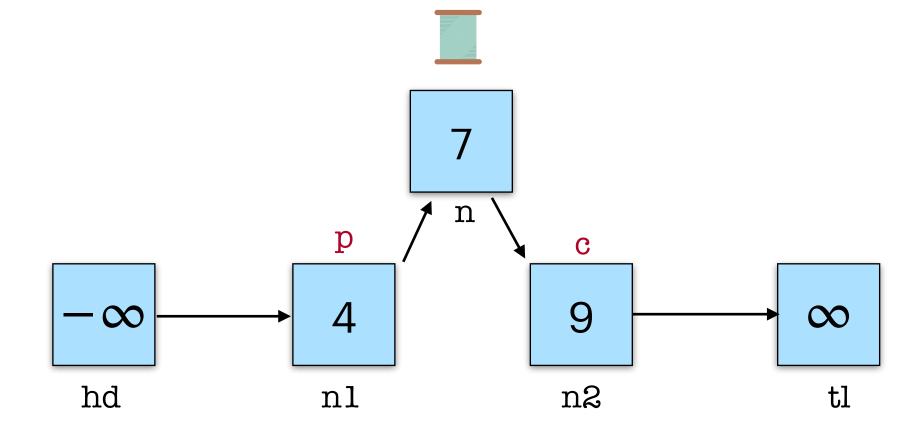




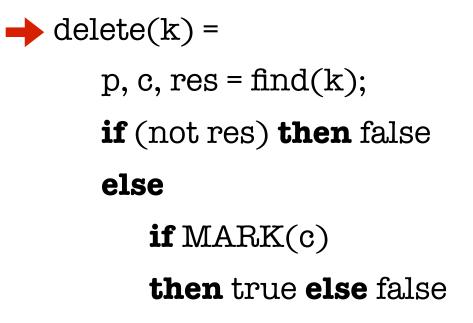


```
insert(k) =
  p, c, res = find(k);
if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

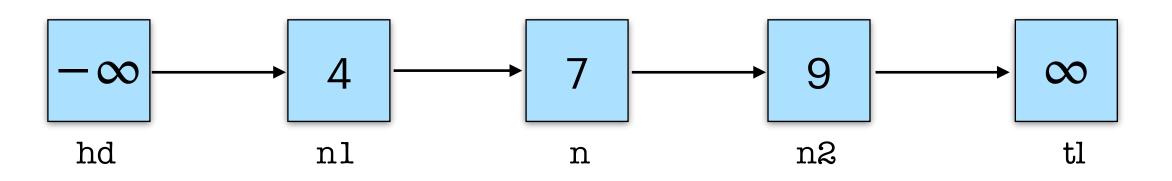




```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```



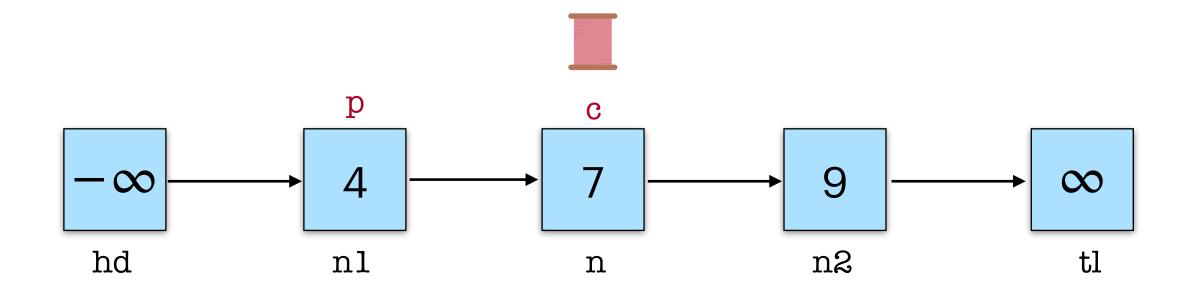




```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

delete(k) =
 p, c, res = find(k);
 if (not res) then false
 else
 if MARK(c)
 then true else false

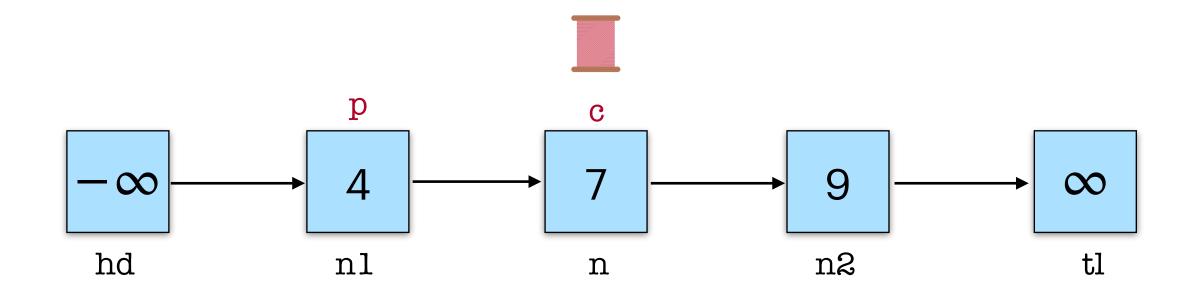




```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```

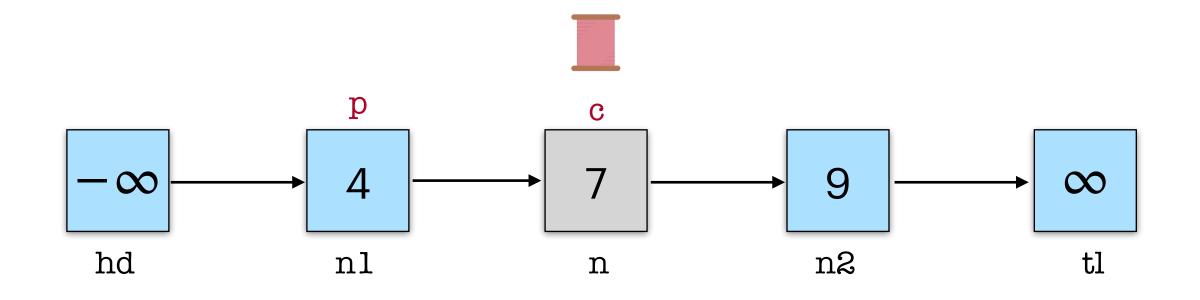




```
insert(k) =
  p, c, res = find(k);
if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

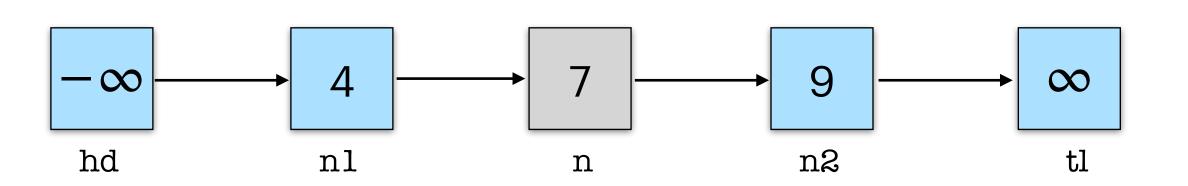
```
search(k) =
_, _, res = find(k);
res

find(k) =
    n = hd.next;
p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
    (n, b) = c.next;
if b == 0 then
    if CAS(p.next, (c,0), (n,0))
    then traverse(k, p, n) else find(k)
else
    if c.key < k then traverse(k, c, n)
    else
    res = c.key == k;
    (p, c, res)</pre>
```

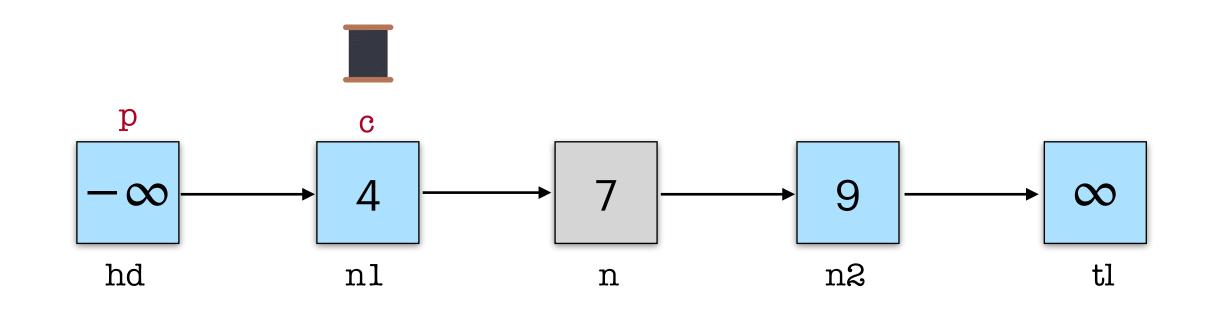
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





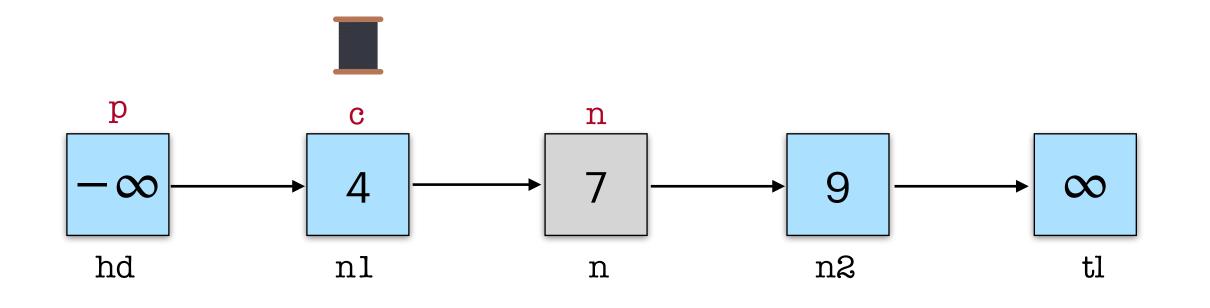
```
search(k) =
  _, _, res = find(k);
  res

find(k) =
  n = hd.next;
  p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
  res = c.key == k;
  (p, c, res)</pre>
```

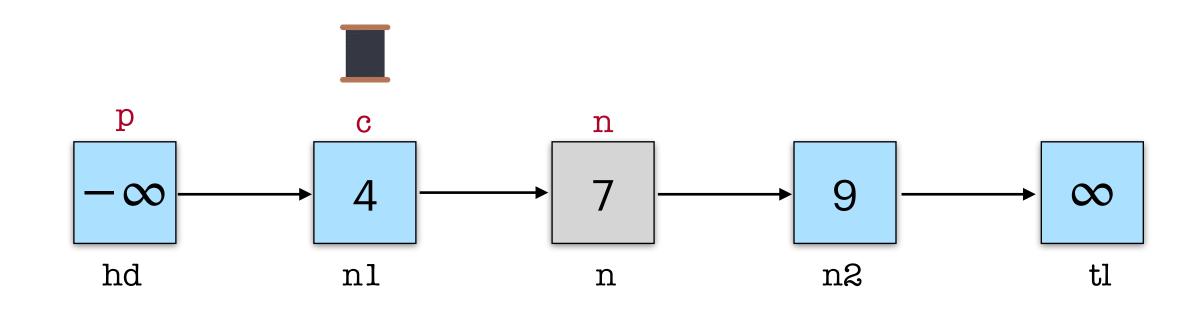
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

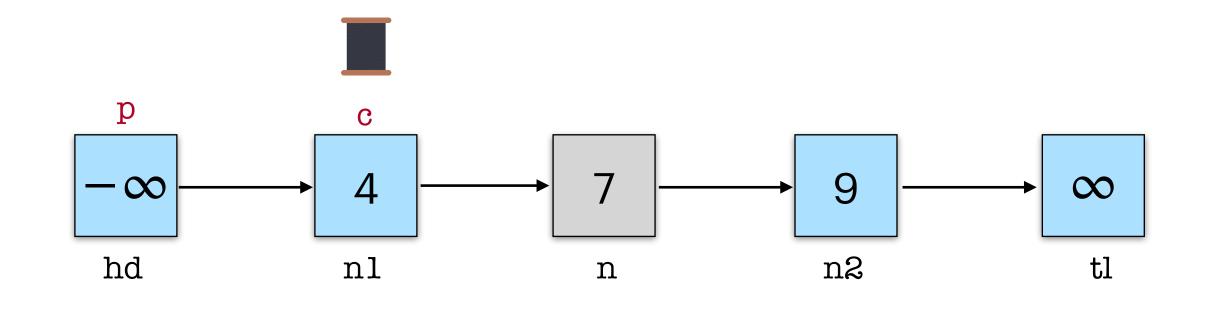
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
    (n, b) = c.next;
if b == 0 then
    if CAS(p.next, (c,0), (n,0))
    then traverse(k, p, n) else find(k)
else
    if c.key < k then traverse(k, c, n)
    else
    res = c.key == k;
    (p, c, res)</pre>
```

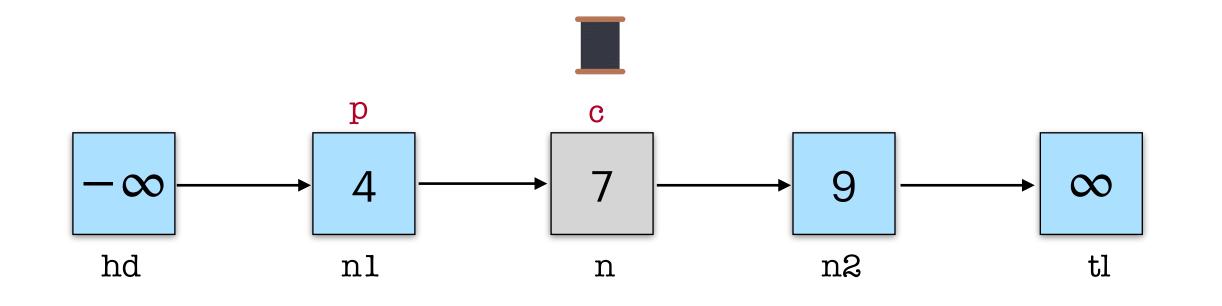
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





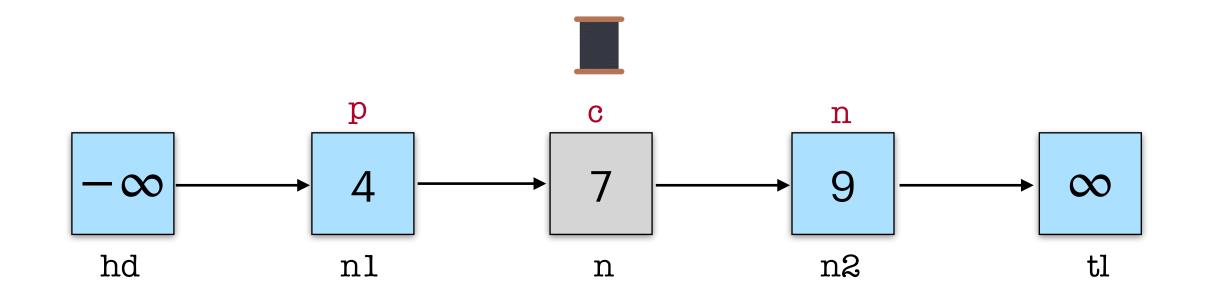
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  → if CAS(p.next, (c,0), (n,0))
    then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
  res = c.key == k;
  (p, c, res)</pre>
```

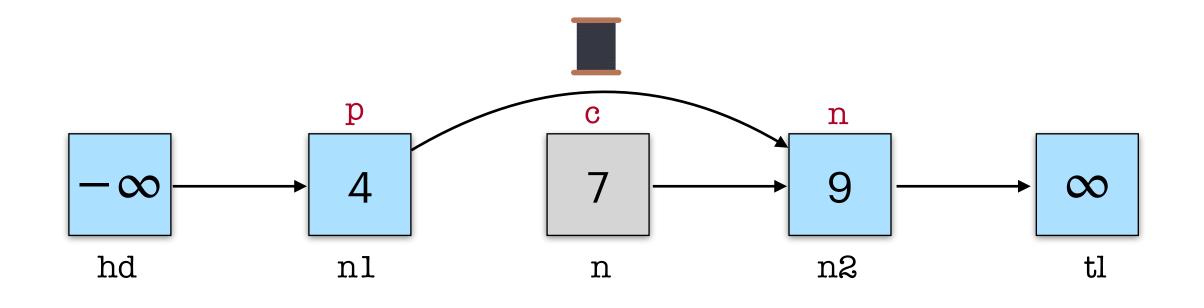
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
  res = c.key == k;
       (p, c, res)</pre>
```

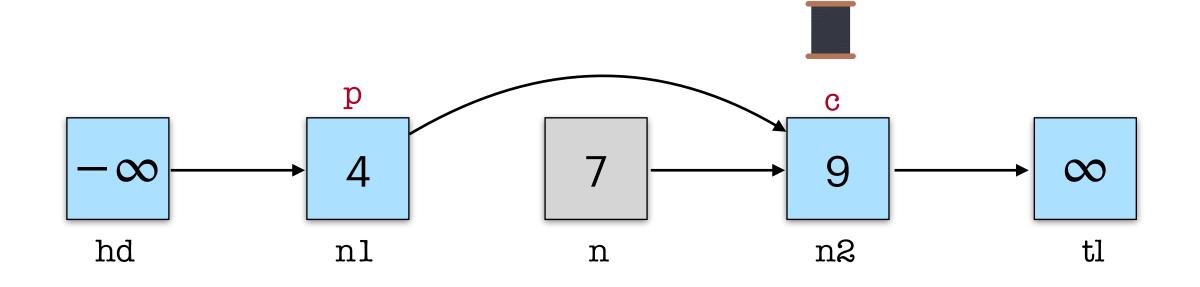
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

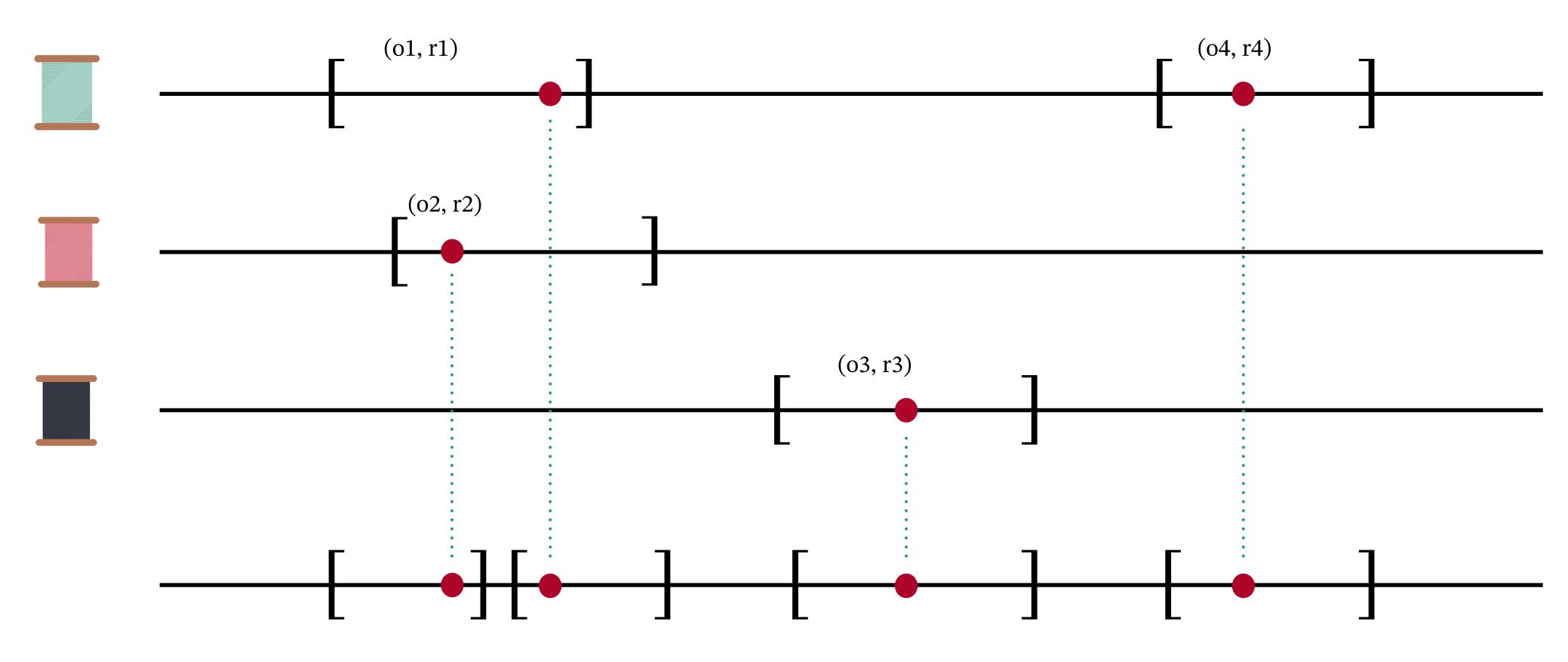
```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





# Linearizability

"for each concurrent execution, there exists an equivalent order-preserving sequential execution"



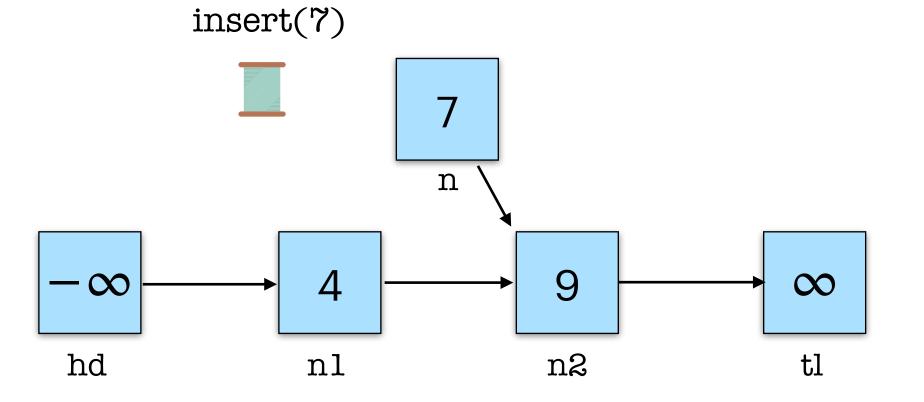
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```



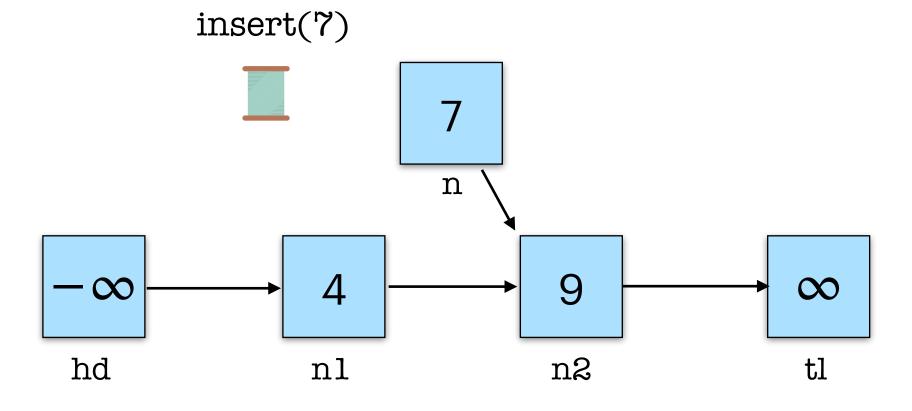
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
     n = new_node(k, c);
  if CAS(p.next, (c, 0), (n, 0))
     then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```



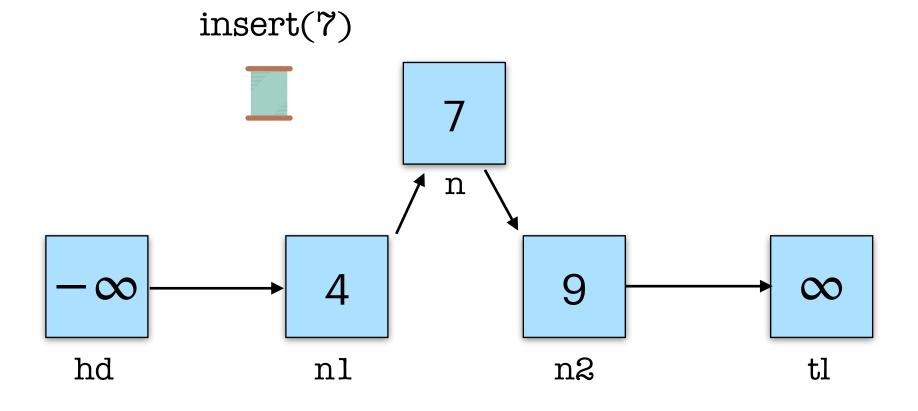
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
     n = new_node(k, c);
  if CAS(p.next, (c, 0), (n, 0))
     then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```



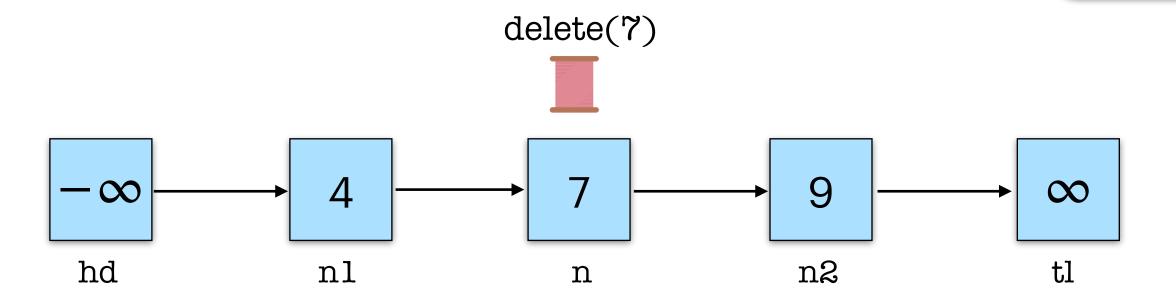
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```



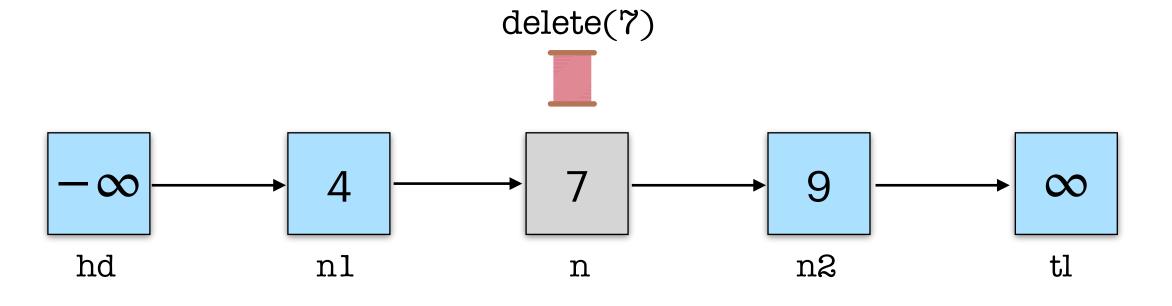
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   __, __, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```



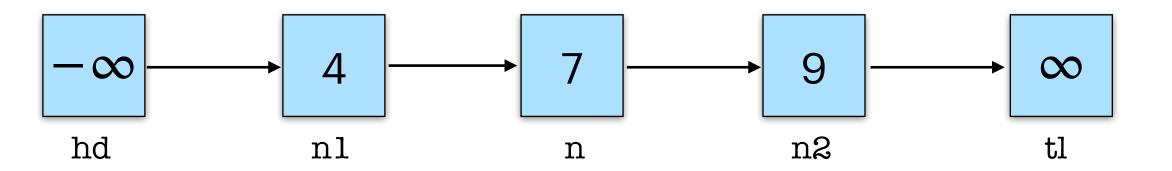
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```



```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

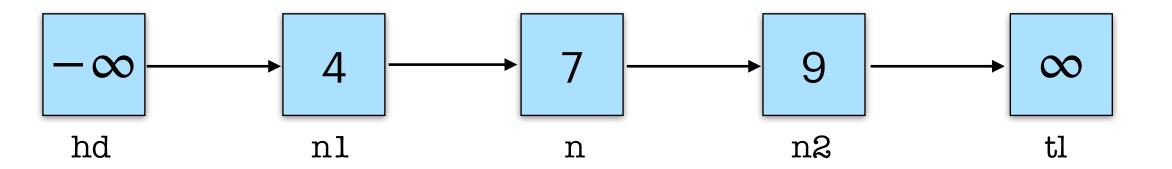
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```

Unmodifying Linearization Points? **Future-dependent, external!** 



```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

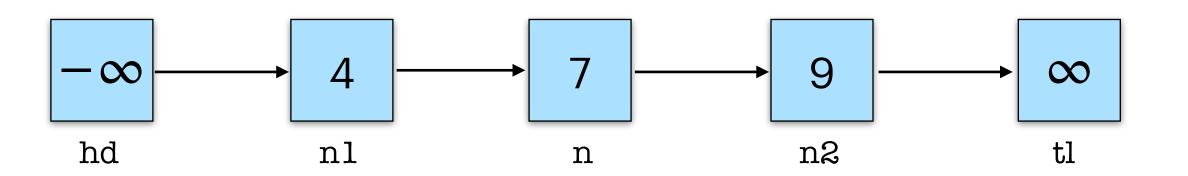
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```

search(7)



```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

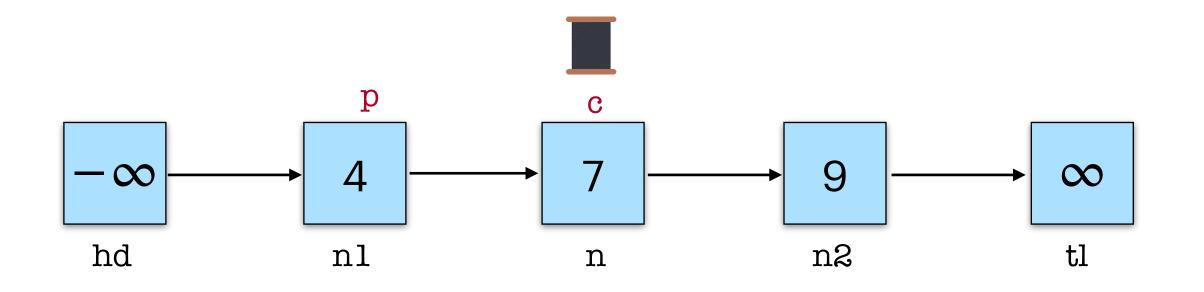
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





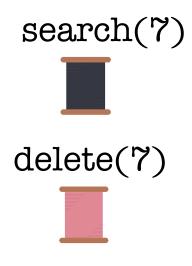
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

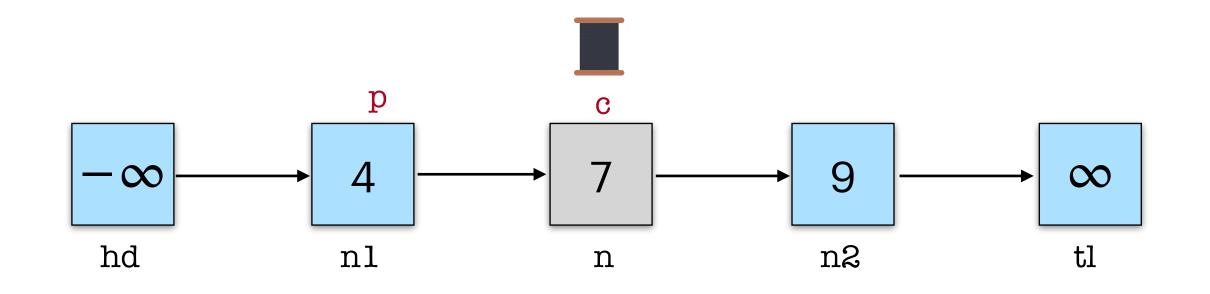
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





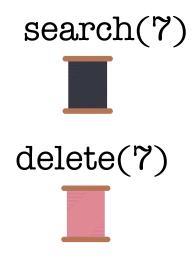
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

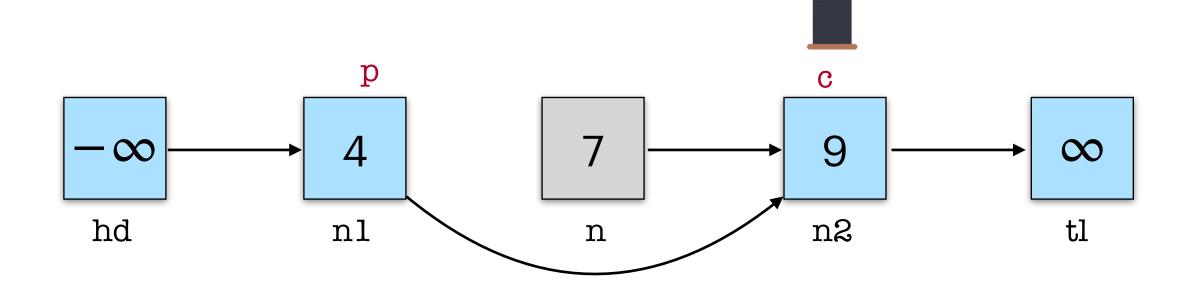
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





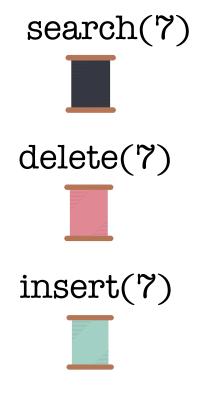
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

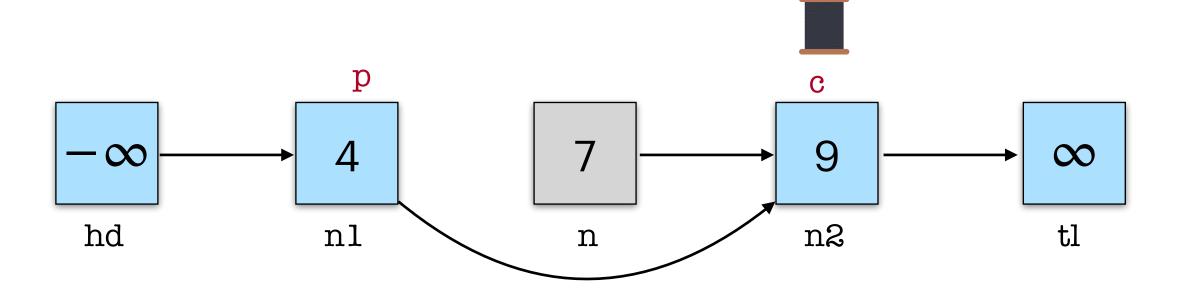
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





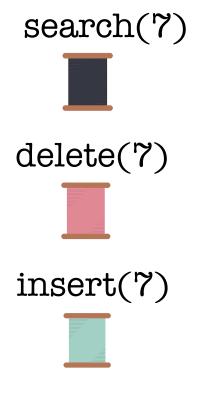
```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

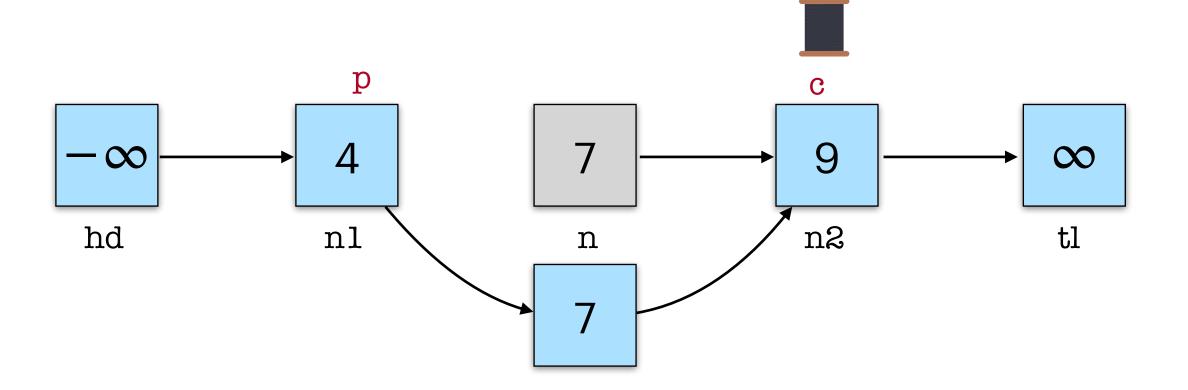
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := p.key < k && next(p) = c && mark(p) = false

```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := p.key < k && next(p) = c && mark(p) = false



```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

Hindsight Reasoning

```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false



- Peter W. O'Hearn et al. Verifying linearizability with hindsight. [PODC 2010]
- Yotam M. Y. Feldman et al. Order out of chaos: Proving linearizability using local views. [DISC 2018]
- Yotam M. Y. Feldman et al. *Proving highly-concurrent traversals correct*. [OOPSLA 2020]
- Roland Meyer, Thomas Wies and Sebastien Wolff. A concurrent program logic with a future and history. [OOPSLA 2022]
- Roland Meyer, Thomas Wies and Sebastien Wolff. Embedding hindsight reasoning in separation logic. [PLDI 2023]

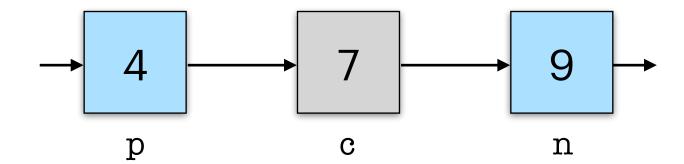
```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then

    if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false



```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

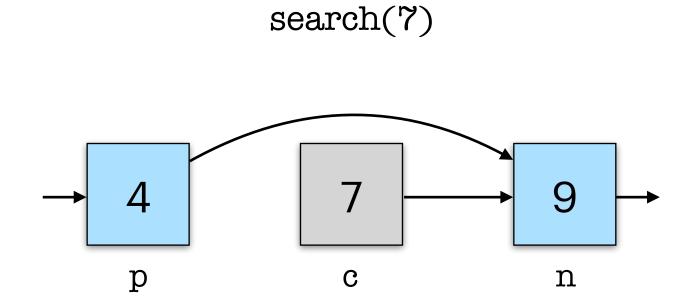
traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then

    if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)

else
    if c.key < k then traverse(k, c, n)
    else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false



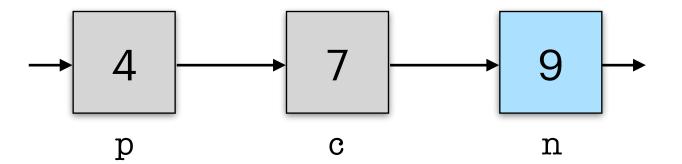
```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then

    if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
            res = c.key == k;
            (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

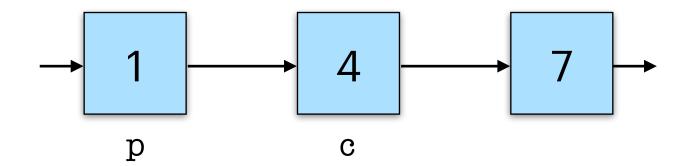


```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

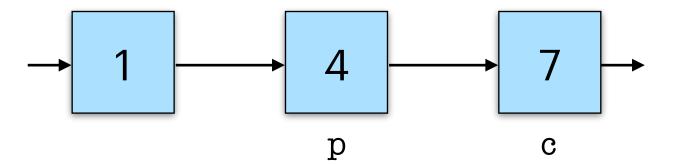


```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

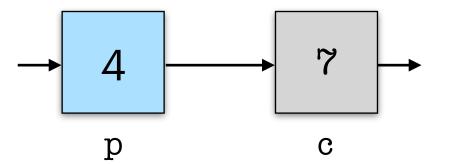


```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

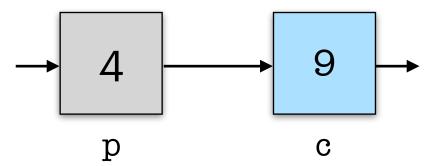


```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false

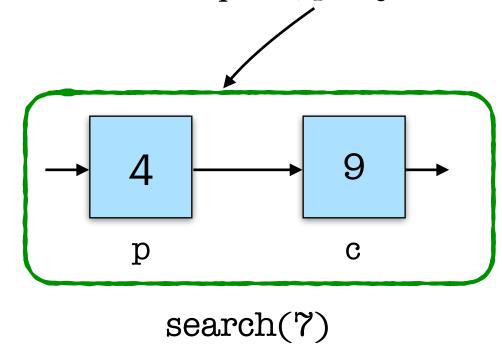


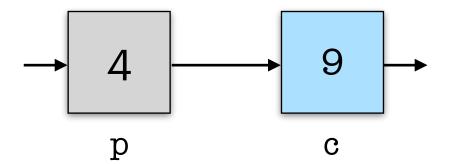
```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false



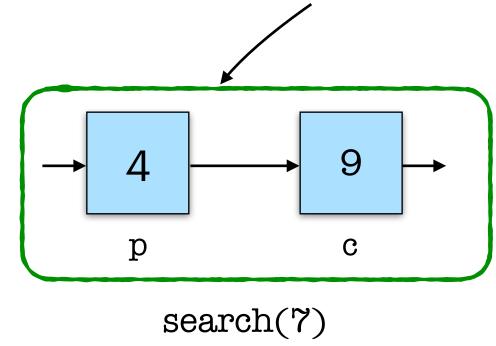


```
find(k) =
    n = hd.next;
    p, c, res = traverse(k, hd, n)

traverse(k, p, c) =
    (n, b) = c.next;
    if b == 0 then
        if CAS(p.next, (c,0), (n,0))
        then traverse(k, p, n) else find(k)
    else
        if c.key < k then traverse(k, c, n)
        else
        res = c.key == k;
        (p, c, res)</pre>
```

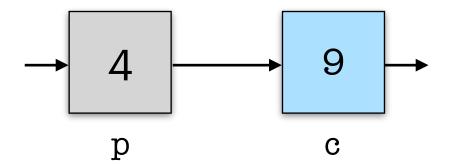
- find(k) returns true  $\rightarrow$  at some point, k was in the structure.
- find(k) returns false  $\rightarrow$  at some point, k was not in the structure.

traversal invariant := at some point, p.key < k && next(p) = c && mark(p) = false



- 1. A node once marked remains marked.
- 2. A node's key never changes.
- 3. hd-list is sorted.

• • • •



#### Michael's Set

```
traverse(k, p, c) =
  (n, b) = c.next;
if b == 0 then
  if CAS(p.next, (c,0), (n,0))
  then traverse(k, p, n) else find(k)
else
  if c.key < k then traverse(k, c, n)
  else
    res = c.key == k;
    (p, c, res)</pre>
```

```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

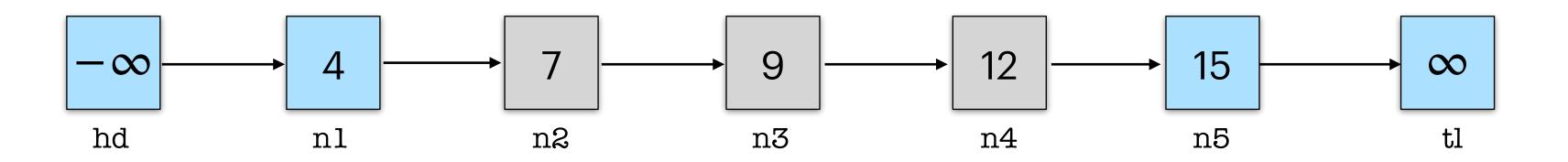
```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if CAS(c.next, (c, 0), (c,1))
    then true else false
```

```
search(k) =
   _-, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```



```
traverse(k, p, pn, c) =
    (n, b) = c.next;
if b == 0 then
        traverse(k, p, pn, n)
else
    if CAS(p.next, (pn, 0), (c, 0)) then
        if c.key < k then traverse(c, n, n)
        else
        res = c.key == k;
        (p, c, res)
    else find(k)</pre>
```

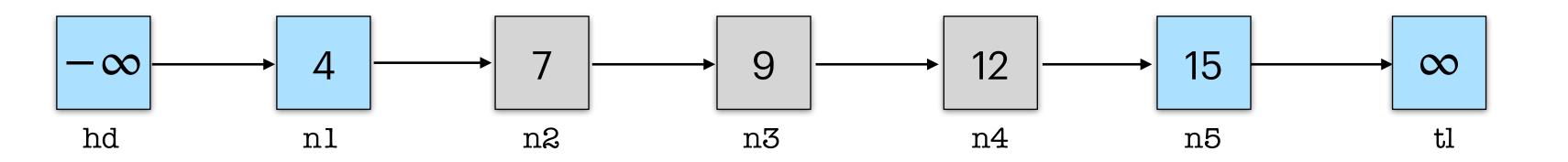
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





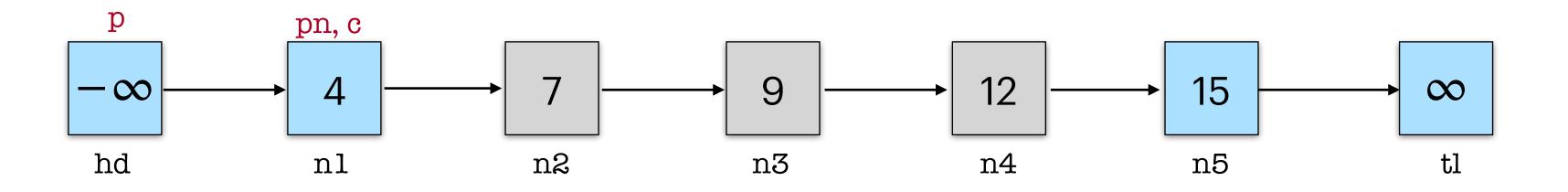
```
search(k) =
   _, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





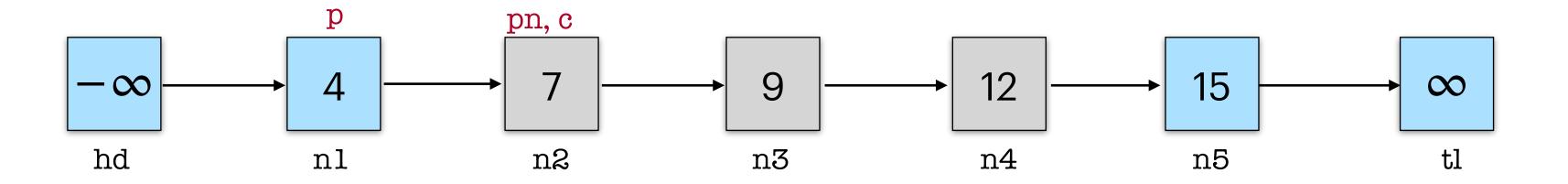
```
search(k) =
   _-, __, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





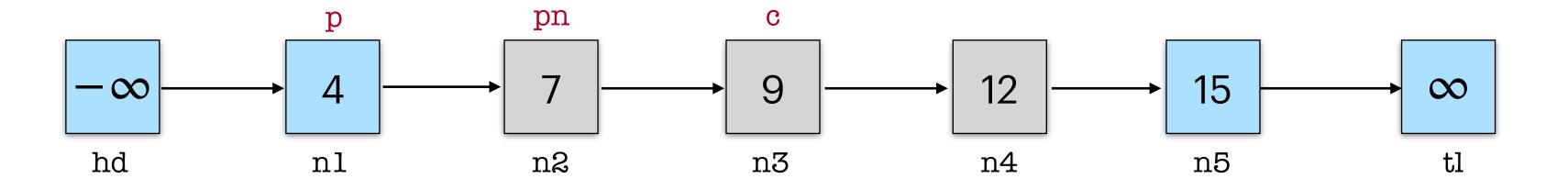
```
search(k) =
   __, _, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
  then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





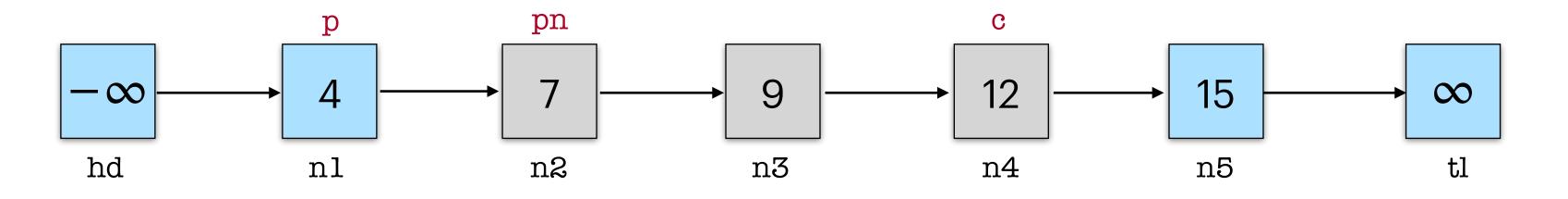
```
search(k) =
   __, _, res = find(k);
   res

find(k) =
    n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
  then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
   if MARK(c)
  then true else false
```





```
traverse(k, p, pn, c) =
    (n, b) = c.next;
if b == 0 then
        traverse(k, p, pn, n)
else
    if CAS(p.next, (pn, 0), (c, 0)) then
        if c.key < k then traverse(c, n, n)
        else
        res = c.key == k;
        (p, c, res)
    else find(k)</pre>
```

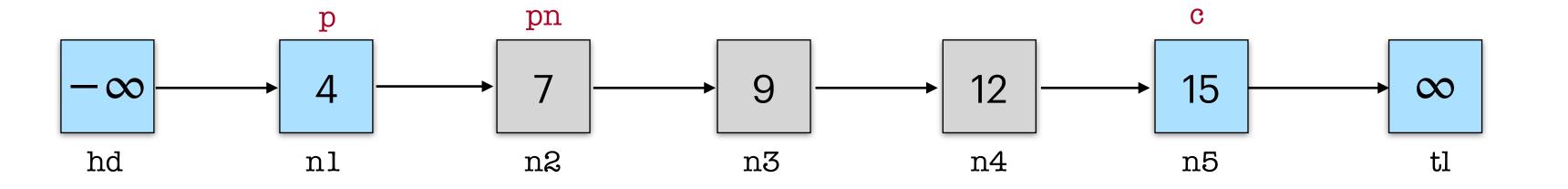
```
search(k) =
   _-, __, res = find(k);
   res

find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
if res then false
else
  n = new_node(k, c);
if CAS(p.next, (c, 0), (n, 0))
  then true else insert(k)
```

```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```





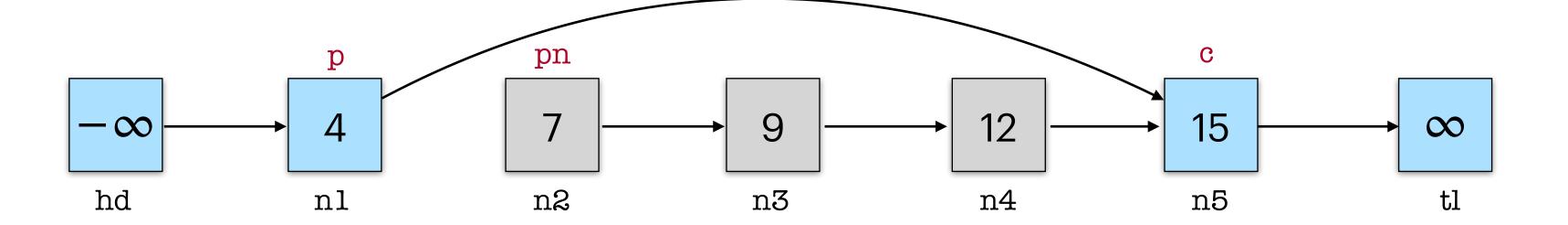
```
search(k) =
   _, _, res = find(k);
   res

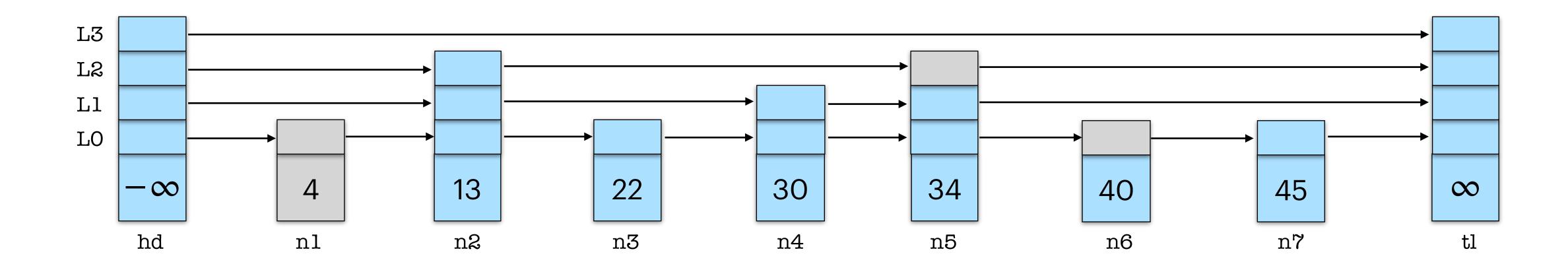
find(k) =
   n = hd.next;
   p, c, res = traverse(k, hd, n, n)
```

```
insert(k) =
  p, c, res = find(k);
  if res then false
  else
    n = new_node(k, c);
    if CAS(p.next, (c, 0), (n, 0))
    then true else insert(k)
```

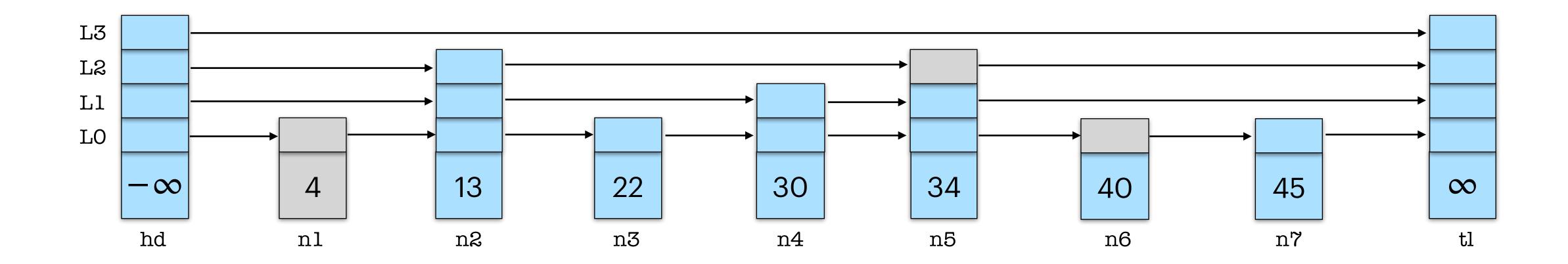
```
delete(k) =
  p, c, res = find(k);
  if (not res) then false
  else
    if MARK(c)
    then true else false
```

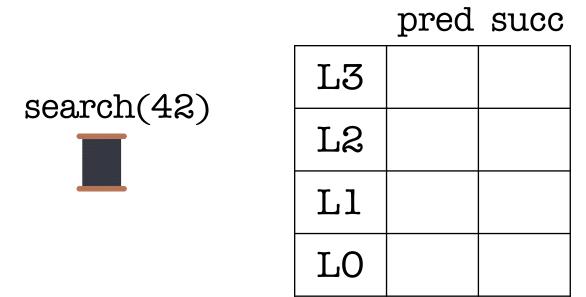


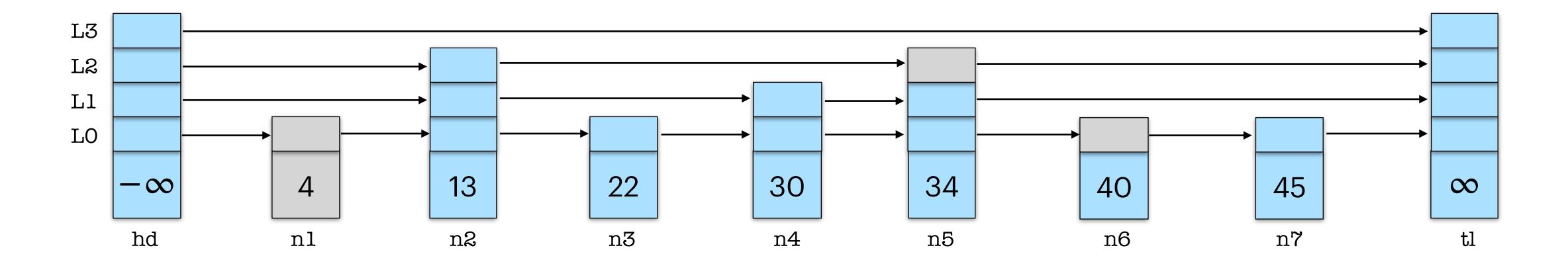




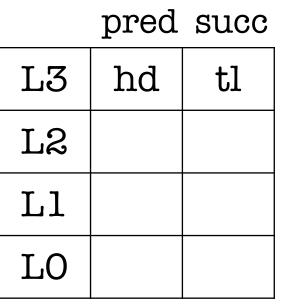


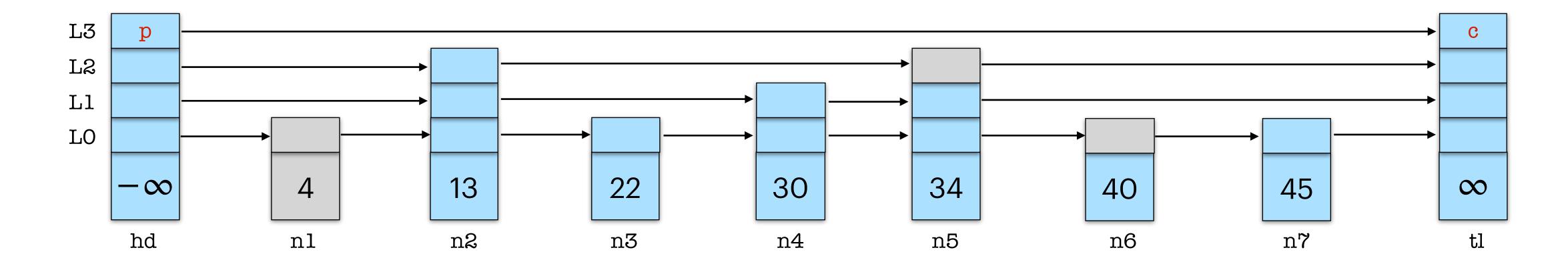




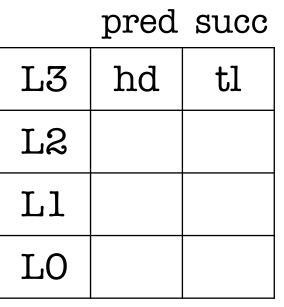


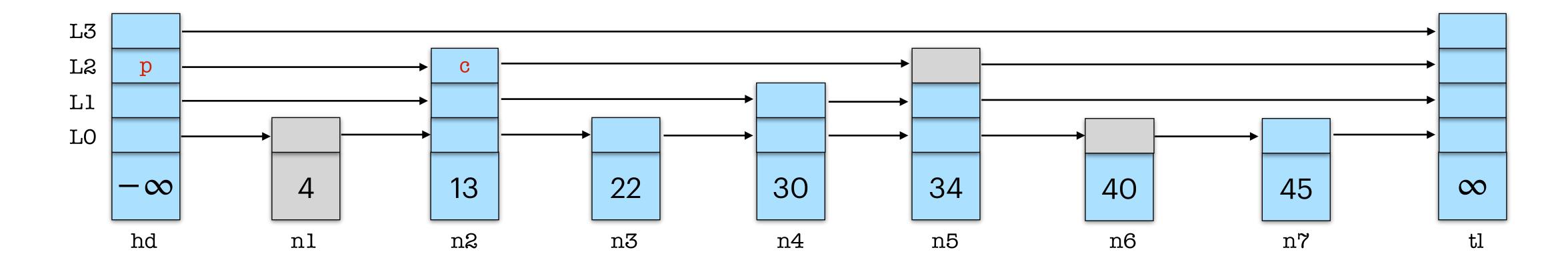


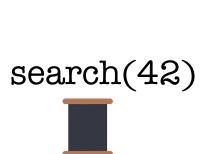


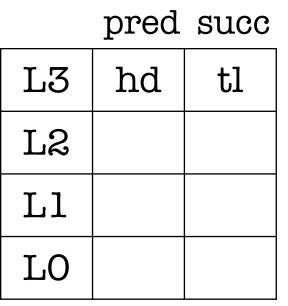


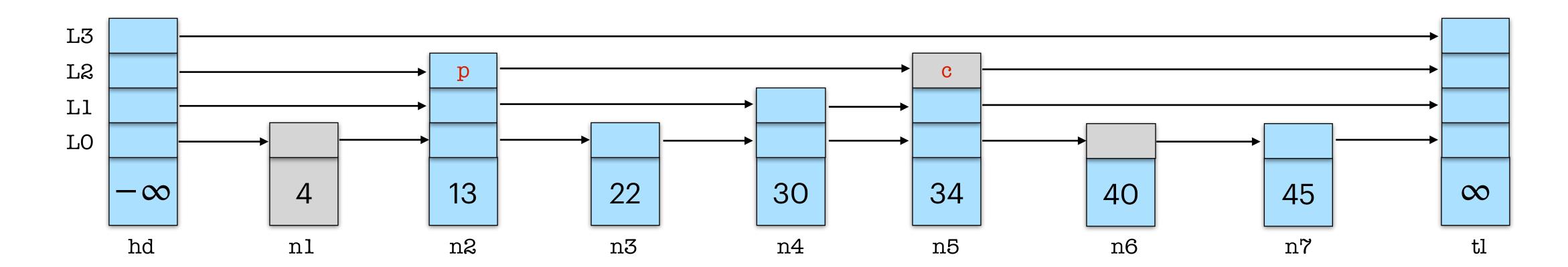




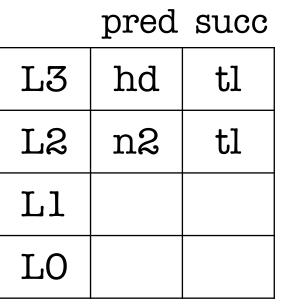


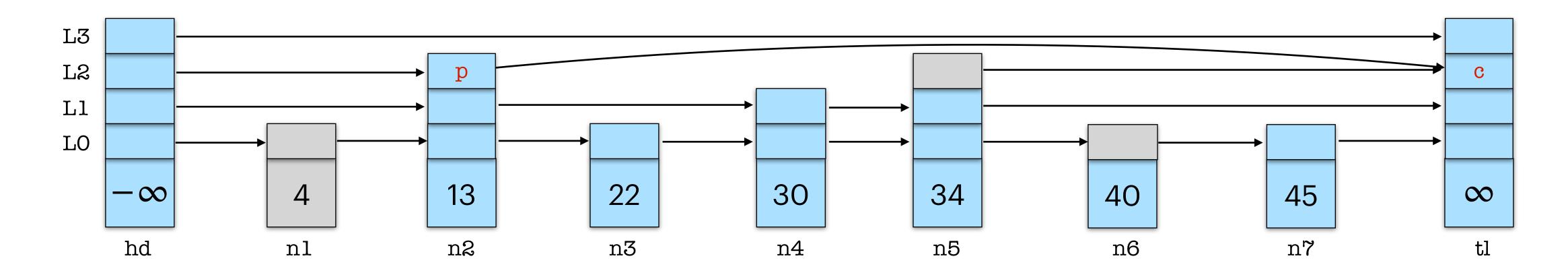




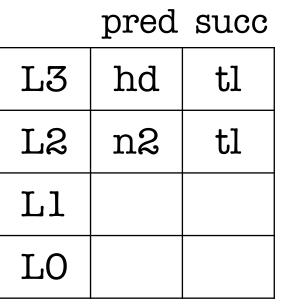


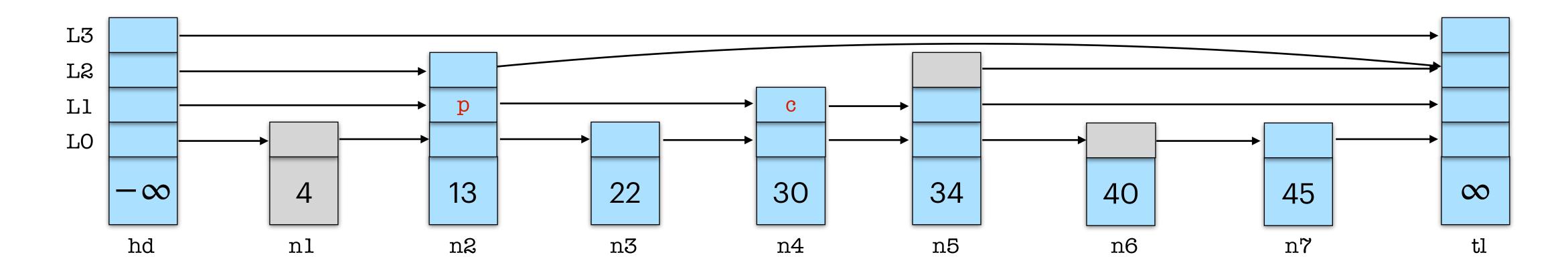




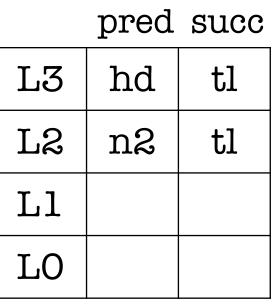


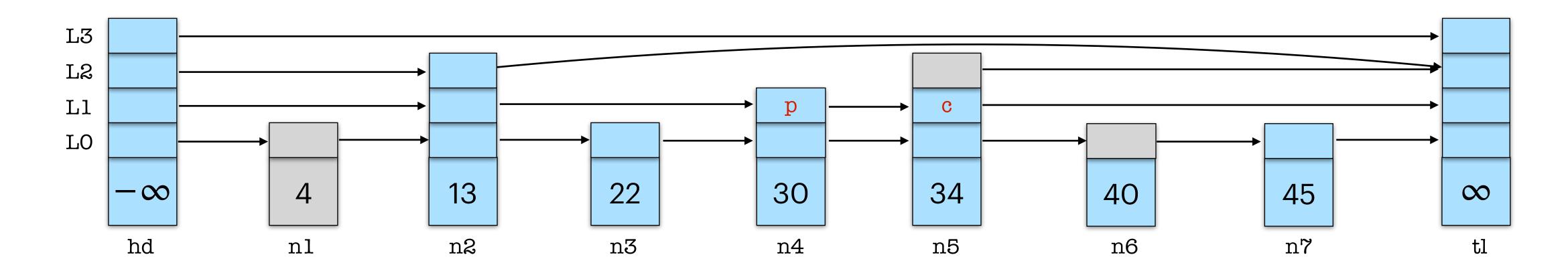






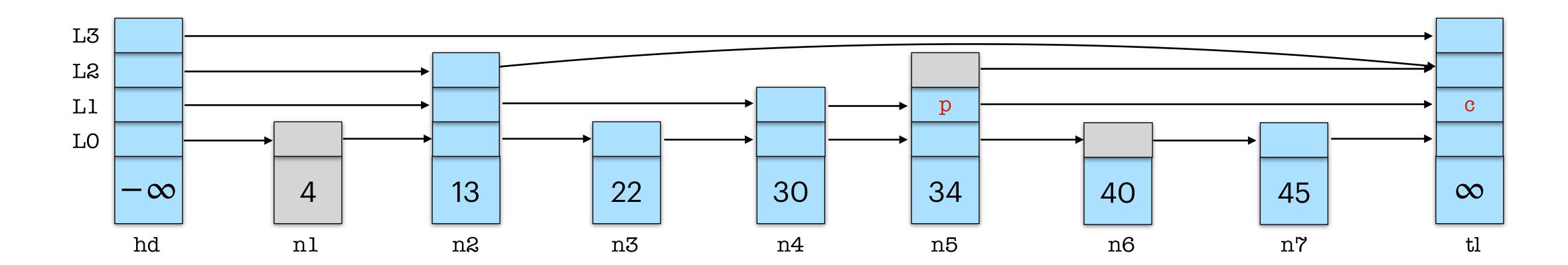






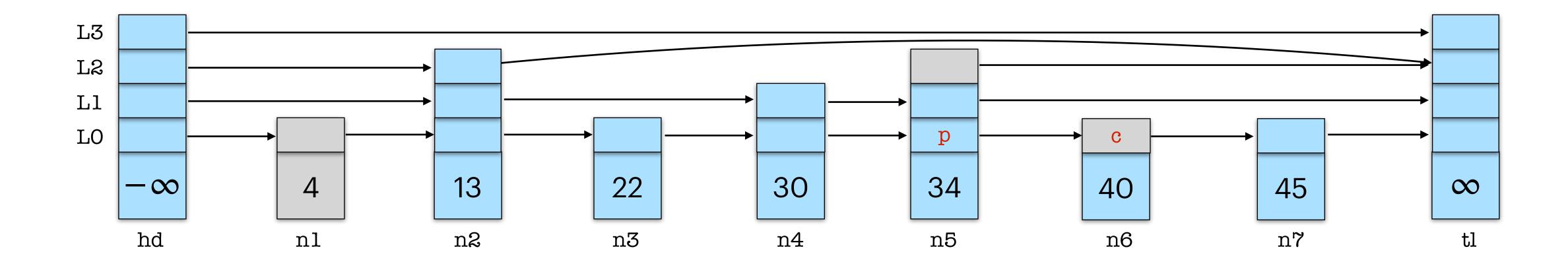


	pred	succ
L3	hd	tl
L2	n2	tl
Ll	n5	tl
LO		



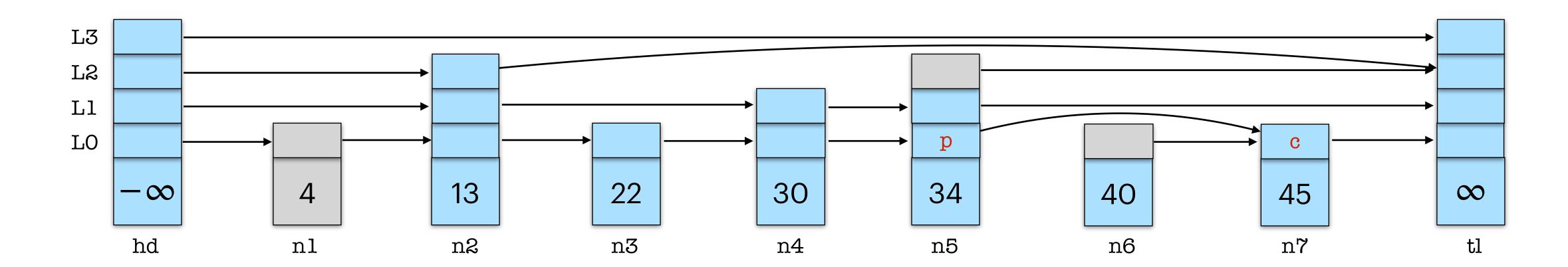


	pred	succ
L3	hd	tl
L2	n2	tl
Ll	n5	tl
LO		



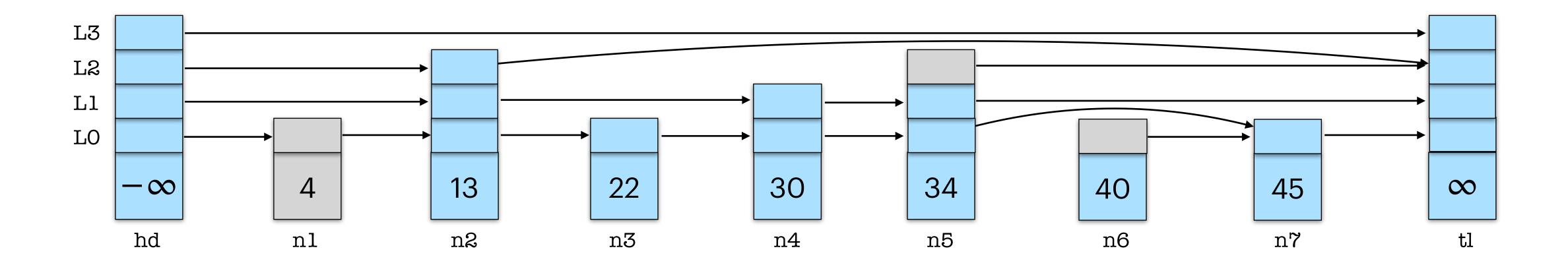


	pred	succ
L3	hd	tl
L2	n2	tl
Ll	n5	tl
LO	n5	n7



# Skiplists

Harris List + Levels  $\approx$  ??



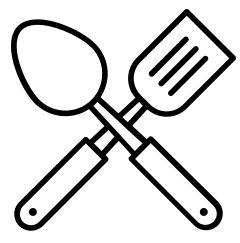
### Outline



Step 1:

Find a class of structures with common correctness reasoning

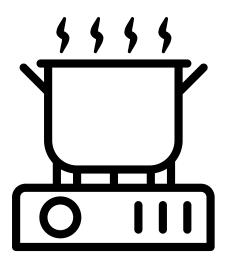
• ECOOP24: (Lock-free) linked lists and skiplists



Step 2:

Develop enabling technology

- Template Algorithms
- Hindsight Framework



Step 3:

Formalize the proof

Evaluation

```
1 let search k =
                                                       18 let insert k =
let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in
                                                         22 if res then
5 res
                                                                  false
7 let delete k =
                                                               else
8 let ps = allocArr L hd in
                                        let h = randomNum L in
9 let cs = allocArr L tl in
                                         let e = \text{createNode } k \ h \ cs \ \text{in}
let p, c, res = traverse ps cs k in
                                                                 match changeNext 0 p c e with
                                                        28 | Success ->
if not res then
       false
                                                        maintainanceOp_ins k ps cs e; true
                                                          | Failure -> insert k
    else
       maintainanceOp_del c;
       match markNode 0 c with
    | Success -> traverse ps cs k; true
     | Failure -> false
17
```

```
1 let search k =
                                        \rightarrow 18 let insert k =
2 let ps = allocArr L hd in

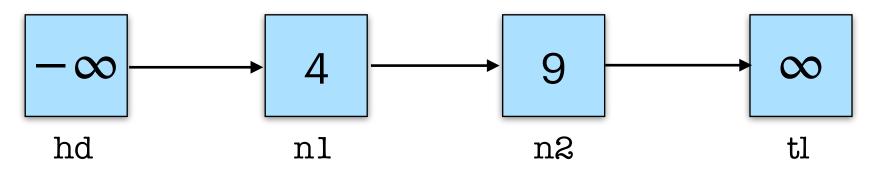
3 let cs = allocArr L tl in

19 let ps = allocArr L hd in

20 let cs = allocArr L tl in
1 let _, _, res = traverse ps cs k in
                                       let p, c, res = traverse ps cs k in
                                           _{22} if res then
5 res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in 25 let h = randomNum L in
9 let cs = allocArr L tl in
                              let e = \text{createNode } k \ h \ cs in
10 let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                          28 | Success ->
if not res then
     false
                                          maintainanceOp_ins k ps cs e; true
                                           | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
   | Success -> traverse ps cs k; true
     | Failure -> false
17
```

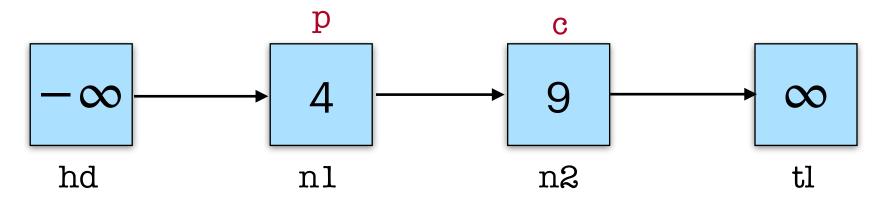
```
1 let search k =
                                        \rightarrow 18 let insert k =
_2 let ps = allocArr L hd in
                                           let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                           let cs = allocArr L tl in
let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
  res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
                                                 match changeNext 0 p c e with
   let p, c, res = traverse ps cs k in
                                                | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```

insert(7)

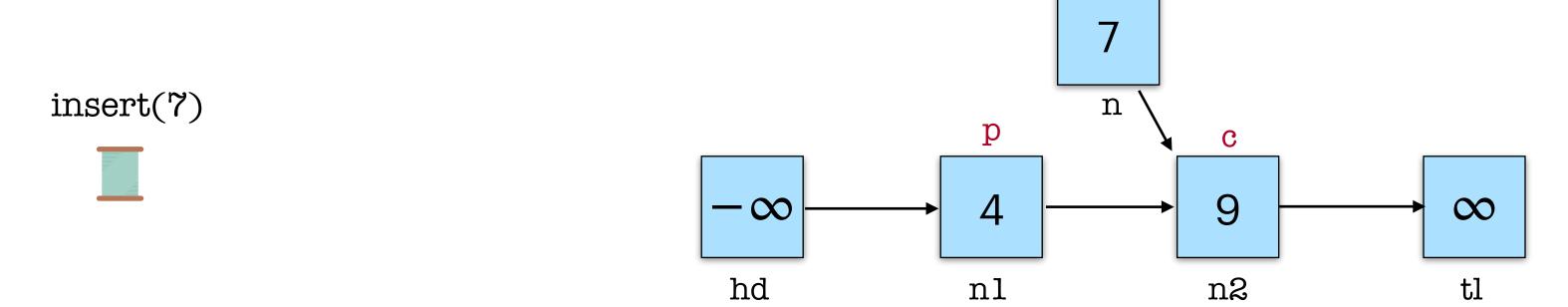


```
1 let search k =
                                           18 let insert k =
_2 let ps = allocArr L hd in
                                         19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                           let cs = allocArr L tl in
let _, _, res = traverse ps cs k in \longrightarrow 21
                                               let p, c, res = traverse ps cs k in
                                               if res then
  res
                                                 false
7 let delete k =
                                                else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
   let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                                | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```

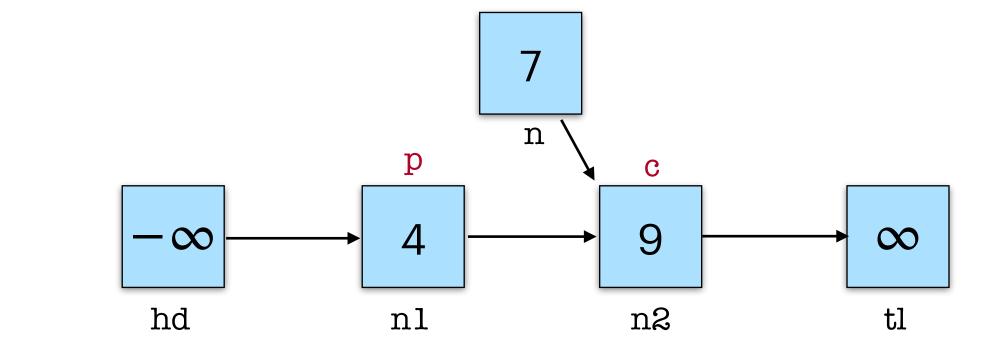
insert(7)



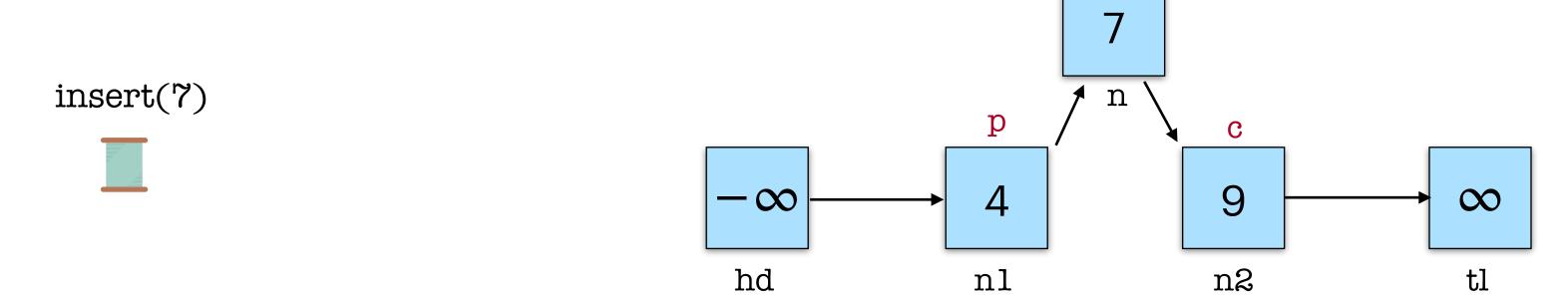
```
1 let search k =
                                            18 let insert k =
let ps = allocArr L hd in
                                          19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                           let cs = allocArr L tl in
  let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
   res
                                                 false
7 let delete k =
                                                else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = \text{createNode } k \ h \ cs in
                                                  match changeNext 0 p c e with
   let p, c, res = traverse ps cs k in
                                                 | Success ->
   if not res then
     false
                                                 maintainanceOp_ins k ps cs e; true
                                                 | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```



```
1 let search k =
                                           18 let insert k =
let ps = allocArr L hd in
                                         19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                         let cs = allocArr L tl in
  let _, _, res = traverse ps cs k in
                                           let p, c, res = traverse ps cs k in
                                               if res then
  res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = \text{createNode } k \ h \ cs in
   let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                                 | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```



```
1 let search k =
                                            18 let insert k =
_2 let ps = allocArr L hd in
                                            19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                            let cs = allocArr L tl in
   let _, _, res = traverse ps cs k in
                                                let p, c, res = traverse ps cs k in
                                                if res then
   res
                                                  false
7 let delete k =
                                                 else
8 let ps = allocArr L hd in
                                                  let h = randomNum L in
9 let cs = allocArr L tl in
                                                  let e = \text{createNode } k \ h \ cs in
   let p, c, res = traverse ps cs k in
                                                  match changeNext 0 p c e with
                                                  | Success ->
   if not res then
     false
                                                   maintainanceOp_ins k ps cs e; true
                                                 | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```



```
1 let search k =
                                                       18 let insert k =
let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in
                                                         22 if res then
5 res
                                                                  false
7 let delete k =
                                                               else
8 let ps = allocArr L hd in
                                        let h = randomNum L in
9 let cs = allocArr L tl in
                                         let e = \text{createNode } k \ h \ cs \ \text{in}
let p, c, res = traverse ps cs k in
                                                                 match changeNext 0 p c e with
                                                        28 | Success ->
if not res then
       false
                                                        maintainanceOp_ins k ps cs e; true
                                                          | Failure -> insert k
    else
       maintainanceOp_del c;
       match markNode 0 c with
    | Success -> traverse ps cs k; true
     | Failure -> false
17
```

```
1 let search k =
                                                           18 let insert k =
   let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in

let ps = allocArr \ L \ hd in
                                                             22 if res then
    5 res
                                                                      false
\rightarrow 7 let delete k =
                                                                    else
    8 let ps = allocArr L hd in
                                             let h = randomNum L in
    9 let cs = allocArr L tl in
                                             let e = \text{createNode } k \ h \ cs \ \text{in}
   let p, c, res = traverse ps cs k in
                                                                      match changeNext 0 p c e with
                                                            28 | Success ->
   if not res then
          false
                                                             maintainanceOp_ins k ps cs e; true
                                                              30 | Failure -> insert k
        else
          maintainanceOp_del c;
          match markNode 0 c with
       | Success -> traverse ps cs k; true
        | Failure -> false
   17
```

```
1 let eager_i i k p c =
                                          14 let eager_rec i ps cs k =
                                         15 let p = ps[i+1] in
2 match findNext i c with
                                         16 let c, _ = findNext i p in
3 | cn, true ->
     match changeNext i p c cn with
                                           let p', c', res = eager_i i k p c in
  | Success -> eager_i i k p cn
                                          ps[i] \leftarrow p';
   | Failure -> traverse ps\ cs\ k
                                          cs[i] \leftarrow c';
7 | cn, false ->
                                          if i = 0 then
     let kc = getKey c in
                                           (p', c', res)
     if kc < k then
                                           22 else
   	exttt{eager_i} i k c cn
10
                                           eager_rec (i-1) ps cs k
     else
11
     let res = (kc = k ? true : false) in
12
                                           25 let traverse ps cs k =
      (p, c, res)
13
                                           eager_rec (L - 2) ps cs k
```

```
1 let search k =
                                             18 let insert k =
let ps = allocArr L hd in

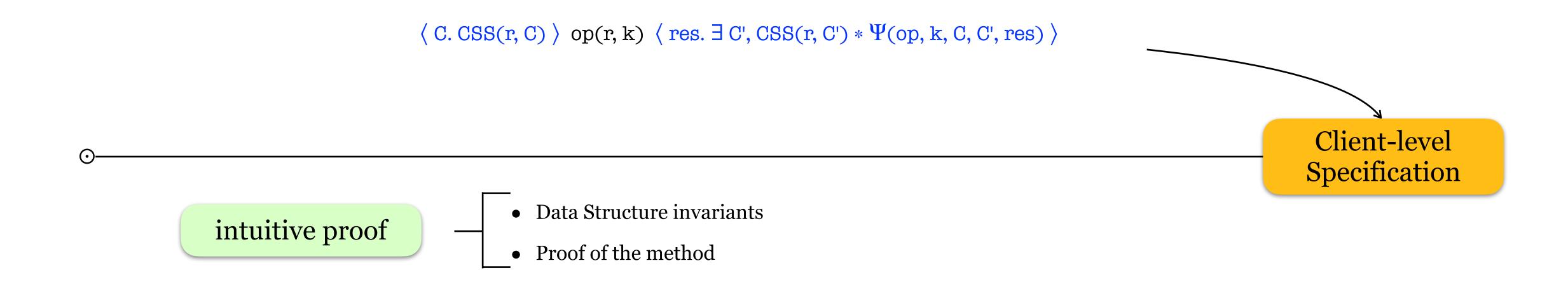
let cs = allocArr L tl in
                                                22 if res then
5 res
                                                        false
7 let delete k =
                                                      else
8 let ps = allocArr L hd in 25 let h = randomNum L in
9 let cs = allocArr L tl in 26 let e = createNode k h cs in
                                                        match changeNext 0 p c e with
let p, c, res = traverse ps cs k in
                                                28 | Success ->
11 if not res then
      false
                                                maintainanceOp_ins k ps cs e; true
                                                  | Failure -> insert k
    else
      maintainanceOp_del c;
      match markNode 0 c with
   | Success -> traverse ps cs k; true
    | Failure -> false
17
```

{ Node(n, k, m, n') } markNode 0 n {  $Node(n, k, m[0 \mapsto true], n')$  }

 $\langle C. CSS(r, C) \rangle op(r, k) \langle res. \exists C', CSS(r, C') * \Psi(op, k, C, C', res) \rangle$ 

```
\langle C. CSS(r, C) \rangle op(r, k) \langle res. \exists C', CSS(r, C') * \Psi(op, k, C, C', res) \rangle
```

```
C = C' \&\& (res \leftrightarrow k \in C) \qquad op = search \Psi(op, k, C, C', res) = C = C' \cup \{k\} \&\& (res \leftrightarrow k \notin C) \quad op = insert C = C' \setminus \{k\} \&\& (res \leftrightarrow k \in C) \quad op = delete
```



Client-level

Specification

 $\left\langle \text{ C. CSS}(\textbf{r},\textbf{C}) \right. \right\rangle \text{ op}(\textbf{r},\textbf{k}) \left\langle \text{ res. } \exists \text{ C'}, \text{CSS}(\textbf{r},\textbf{C'}) * \Psi(\text{op},\textbf{k},\textbf{C},\textbf{C'},\text{res}) \right\rangle$ 

intuitive proof

- Data Structure invariants
- Proof of the method
- Prophecy variables:
  - What to predict?
- Helping Protocol:
  - Which threads require helping?
  - Who does the helping?
  - When is helping required?

 $\langle C. CSS(r, C) \rangle$  op(r, k)  $\langle res. \exists C', CSS(r, C') * \Psi(op, k, C, C', res) \rangle$ Client-level Specification Data Structure invariants intuitive proof • Proof of the method • Prophecy variables: • What to predict? Is there a uniform • Helping Protocol: answer? • Which threads require helping? • Who does the helping? • When is helping required?

 $\langle \text{C. CSS}(\textbf{r}, \textbf{C}) \rangle \text{ op}(\textbf{r}, \textbf{k}) \langle \text{res. } \exists \, \textbf{C'}, \, \textbf{CSS}(\textbf{r}, \textbf{C'}) * \Psi(\text{op}, \textbf{k}, \textbf{C}, \textbf{C'}, \, \textbf{res}) \rangle$   $\begin{array}{c} \text{Client-level} \\ \text{Specification} \\ \\ \bullet \text{ Proof of the method} \\ \\ \hline \bullet \text{ Prophecy variables:} \end{array}$ 

Is there a uniform answer?

Yes!

- Which threads require helping?
- Who does the helping?

• What to predict?

• Helping Protocol:

• When is helping required?

## Hindsight Framework

Data Structure invariants

Hindsight Specification

• Prophecy variables

Client-level Specification

Proof of the method

• Helping Protocol

#### **Hindsight Specification:**

• Precondition : Modifying LP —— Postcondition : Receipt of linearization

• Precondition: Unmodifying LP  $\longrightarrow$  Postcondition: at some point during the execution,  $\Psi(op, k, C, C', res)$  was true

# Hindsight Framework

• Data Structure invariants

• Proof of the method

Hindsight Specification

Data Structure Agnostic • Prophecy variables

Helping Protocol

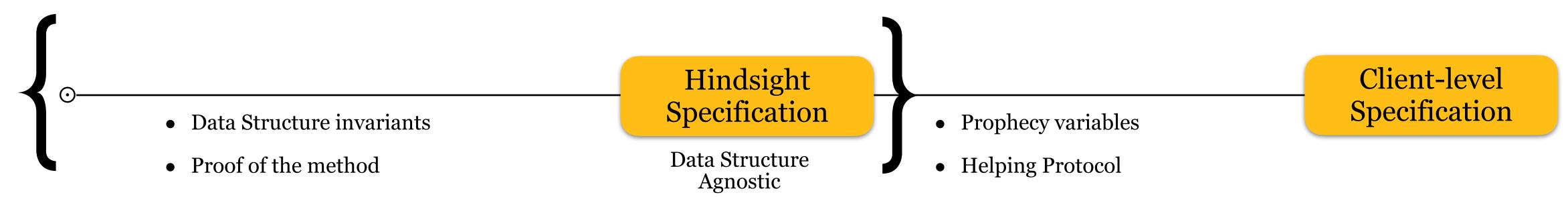
Client-level Specification

#### **Hindsight Specification:**

- Precondition : Modifying LP —— Postcondition : Receipt of linearization
- Precondition: Unmodifying LP  $\longrightarrow$  Postcondition: at some point during the execution,  $\Psi(op, k, C, C', res)$  was true

## Hindsight Framework

**Proof Author Obligations** 



#### **Hindsight Specification:**

- Precondition : Modifying LP —— Postcondition : Receipt of linearization
- Precondition: Unmodifying LP  $\longrightarrow$  Postcondition: at some point during the execution,  $\Psi(op, k, C, C', res)$  was true

Framework provides:

Client-level Specification

#### Framework provides:

o: Shared state invariant for storing history

Client-level Specification

#### Framework provides:



Client-level Specification

1: Determine steps that may change the abstract state

#### Framework provides:

o: Shared state invariant for storing history

Client-level Specification

1: Determine steps that may change the abstract state

```
18 let insert k =
                                                  let ps = allocArr L hd in
 7 let delete k =
                                                  let cs = allocArr L tl in
   let ps = allocArr L hd in
                                                  let p, c, res = traverse ps cs k in
    let cs = allocArr L tl in
                                                  if res then
    let p, c, res = traverse ps cs k in
                                                   false
    if not res then
                                                  else
      false
                                                   let h = randomNum L in
    else
                                                   let e = createNode k h cs in
      maintainanceOp del c;
                                                    match changeNext 0 p c e with
      match markNode 0 c with
                                                    | Success ->
        Success -> traverse ps cs k; true
                                                     maintainanceOp_ins \ k \ ps \ cs \ e; \ true
       Failure -> false
                                                    | Failure -> insert k
17
```

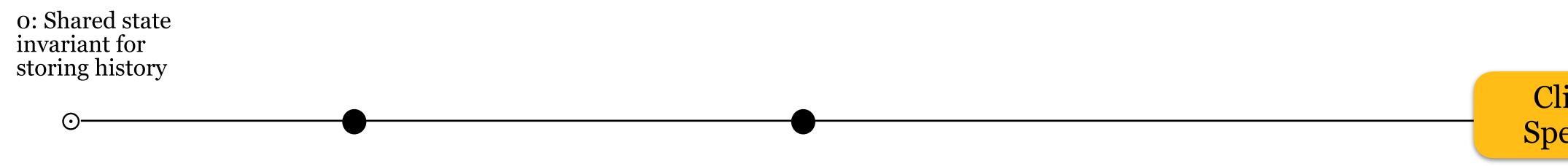
#### Framework provides:



Client-level Specification

1: Determine steps that may change the abstract state

#### Framework provides:

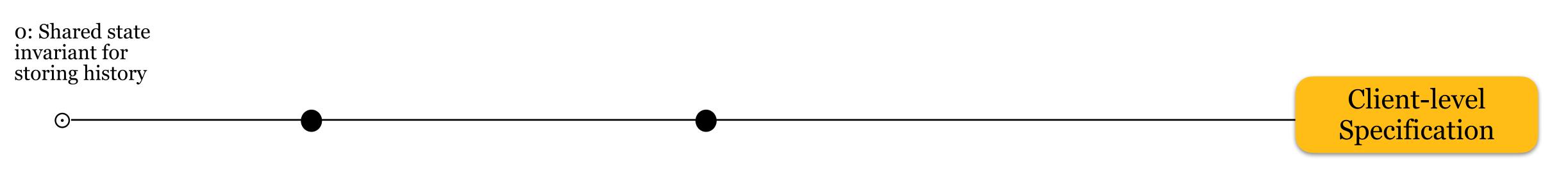


Client-level Specification

1: Determine steps that may change the abstract state

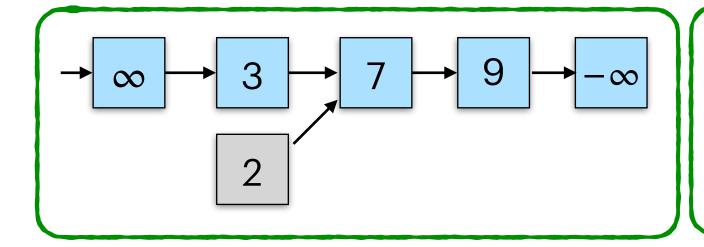
2: Define a "snapshot" and provide data structure invariants

#### Framework provides:



1: Determine steps that may change the abstract state

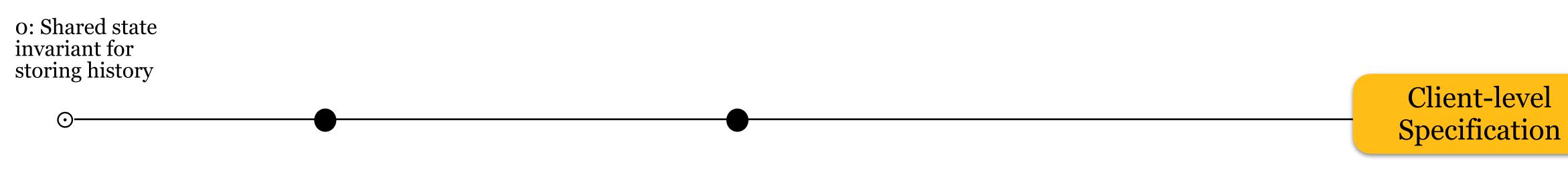
2: Define a "snapshot" and provide data structure invariants



- 1. A node once marked remains marked.
- 2. A node's key never changes.
- 3. hd-list is sorted.

• • • •

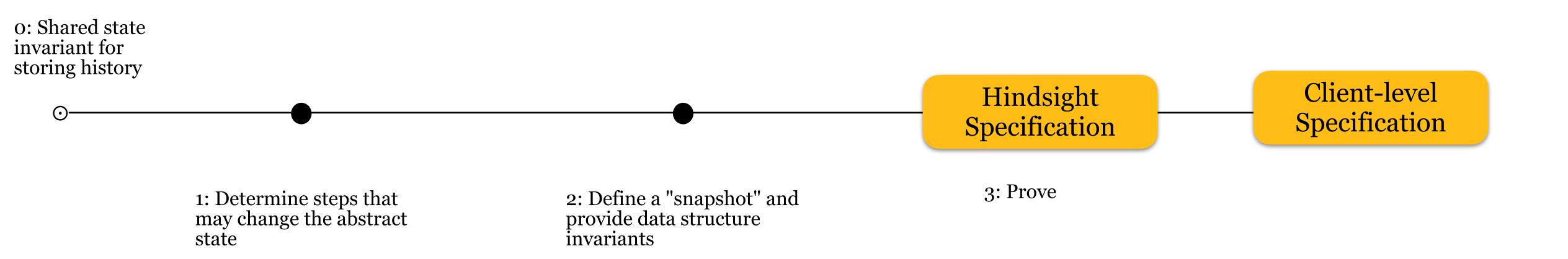
#### Framework provides:



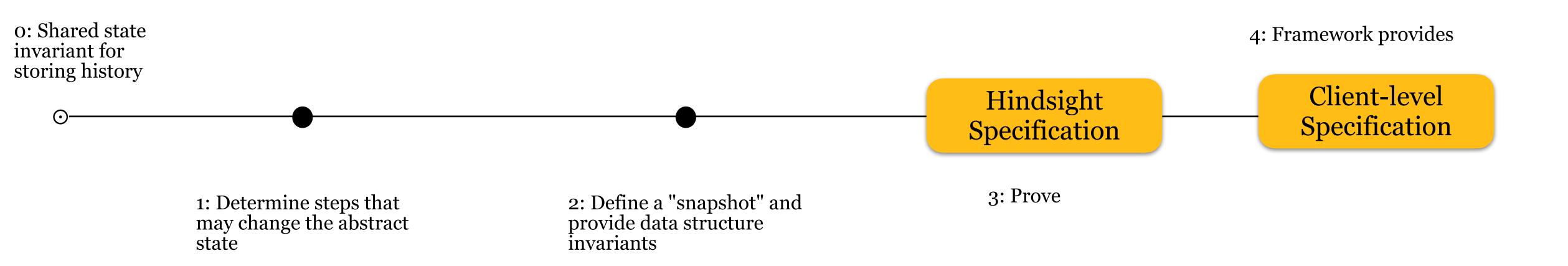
1: Determine steps that may change the abstract state

2: Define a "snapshot" and provide data structure invariants

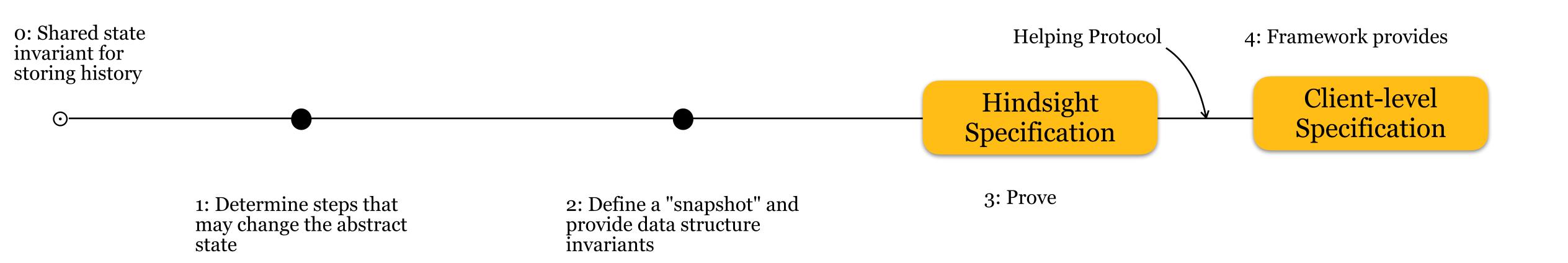
#### Framework provides:



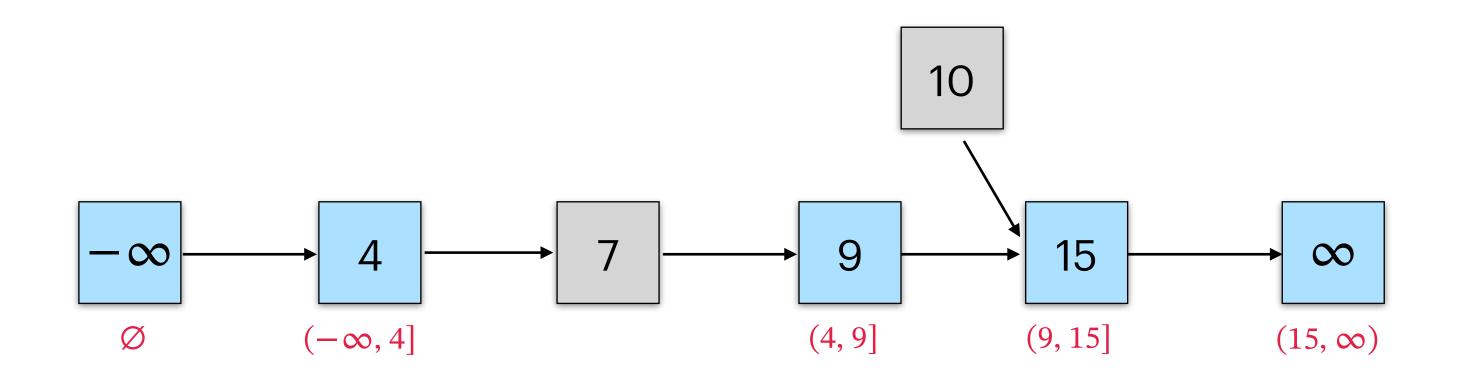
#### Framework provides:



#### Framework provides:



## Global Graph Properties



#### Edgeset Framework:

• Dennis E. Shasha and Nathan Goodman. Concurrent Search Structure Algorithms. [Database Syst. 1988]

#### Flow Framework:

- Siddharth Krishna, Dennis E. Shasha and Thomas Wies. *Go with the flow: compositional abstractions for concurrent data structures.* [POPL 2018]
- Siddharth Krishna, Alexander J. Summers and Thomas Wies. *Local reasoning for global graph properties*. [ESOP 2020]
- Siddharth Krishna et al., Verifying concurrent search structure templates. [PLDI 2020]

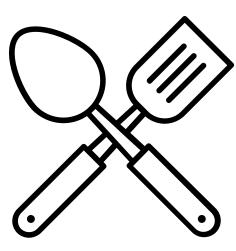
### Outline



Step 1:

Find a class of structures with common correctness reasoning

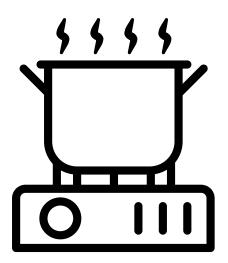
• ECOOP24: (Lock-free) linked lists and skiplists



Step 2:

Develop enabling technology

- Template Algorithms
- Hindsight Framework



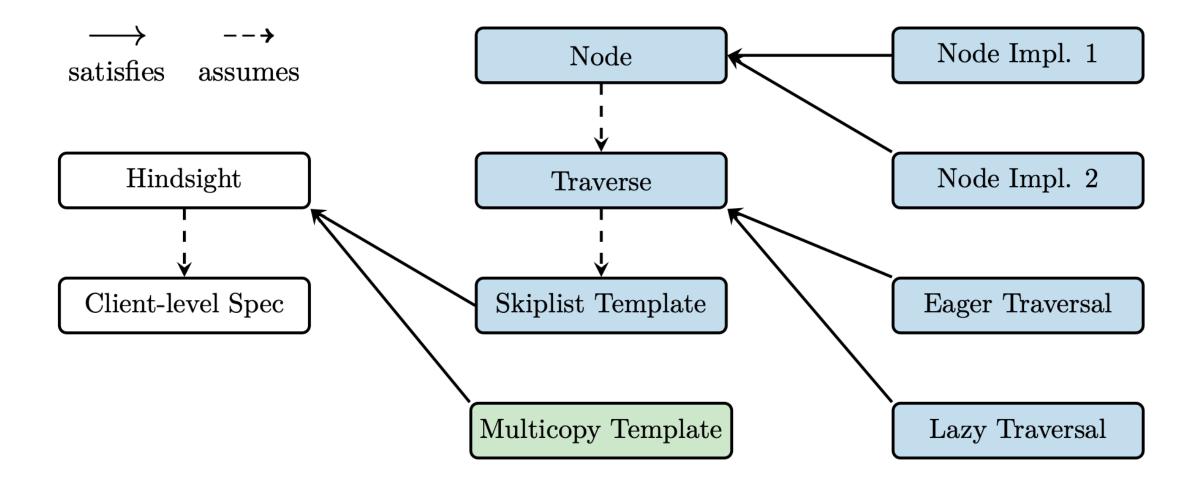
Step 3:

Formalize the proof

Evaluation

### Evaluation

- History stored as shared state invariant using a combination of authoritative and agreement RA.
- Heavy use of Coq's module system.
- Code available publicly on Github, artifact available on Zenodo.







#### Skiplist Template (Iris/Coq)

Module	Code	Proof	Total	Time
Flow Library	0	5330	5330	33
Hindsight	0	950	950	11
Client-level Spec	9	329	338	18
Skiplist	12	1693	1705	26
Skiplist Init(*)	6	319	325	15
Skiplist Search(*)	7	62	69	6
Skiplist $Insert(*)$	37	3457	3494	111
Skiplist Delete(*)	28	2401	2429	72
Node Impl. 1	118	908	1026	35
Node Impl. 2	106	836	942	35
Eager Traversal	38	1165	1203	96
Lazy Traversal	47	2063	2110	145
Total	408	19513	19921	603
Herlihy-Shavit	234	9933	10167	361

#### Evaluation - Multicopy

- Original proofs for the Multicopy template from OOPSLA21.
- Hindsight proofs use the hindsight framework.
- Original proofs use a bespoke helping protocol, while hindsight proofs avoid this.
- $\approx$ 53% proof reduction.

#### Multicopy Template (Iris/Coq)

Module	Original	Hindsight
Defs	866	
Client-level Spec	434	
LSM	741	540
Search	411	399
Upsert	327	371
Total	2779	1310

#### Thank you!

• Data Structure invariants

• Proof of the method

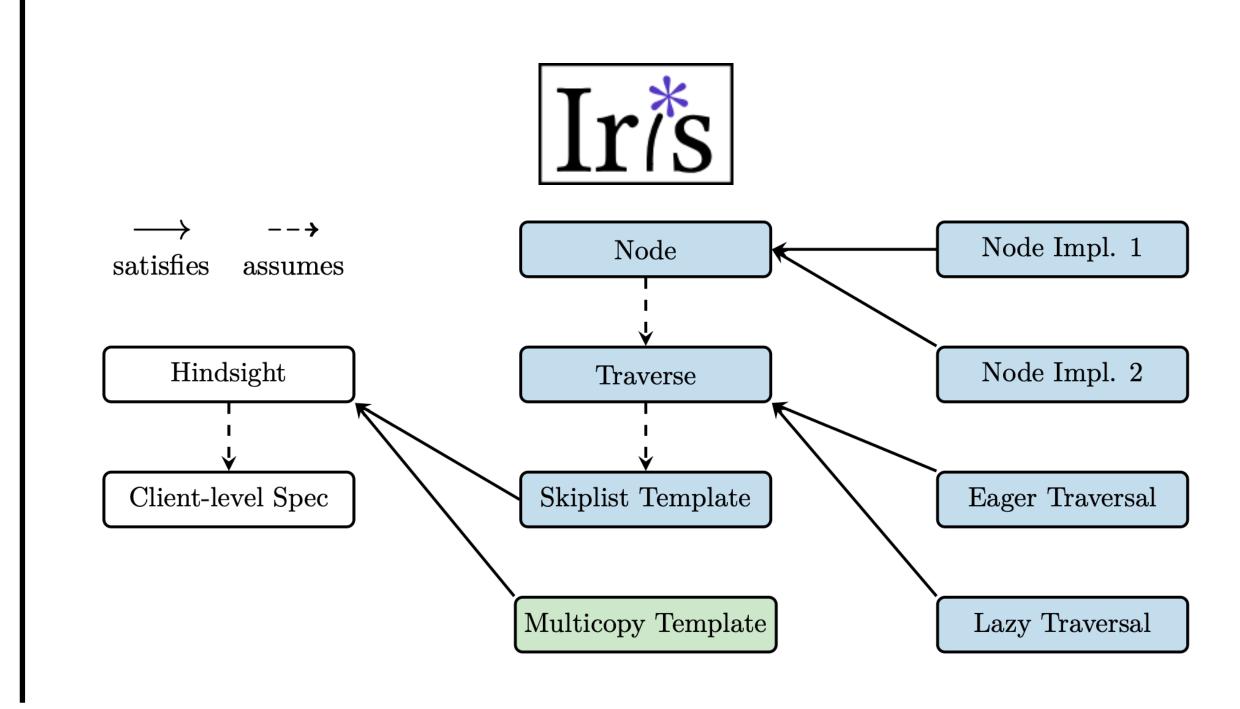
Hindsight Specification

Data Structure Agnostic • Prophecy variables

Helping Protocol

Client-level Specification

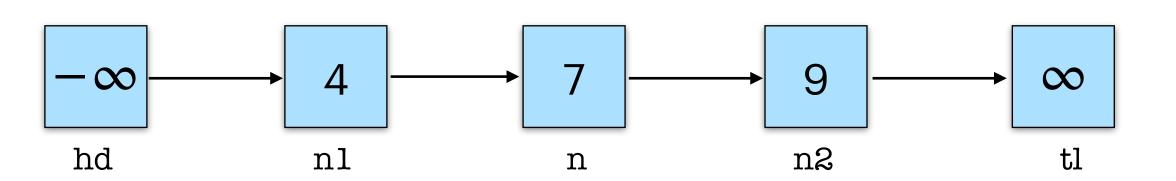
```
1 let search k =
                                                 18 let insert k =
    let ps = allocArr L hd in
                                                 19 let ps = allocArr L hd in
    let cs = allocArr L tl in
                                                 let cs = allocArr L tl in
    let _, _, res = traverse ps cs k in
                                                     let p, c, res = traverse ps cs k in
                                                     if res then
    res
                                                       false
7 let delete k =
                                                     else
    let ps = allocArr L hd in
                                                       let h = randomNum L in
    let cs = allocArr L tl in
                                                       let e = \text{createNode } k \ h \ cs \ \text{in}
    let p, c, res = traverse ps cs k in
                                                       match changeNext 0 p c e with
                                                         Success ->
    if not res then
      false
                                                         	ext{maintainanceOp\_ins} \ k \ ps \ cs \ e; \ true
                                                         Failure -> insert k
    else
      maintainanceOp_del c;
       {\tt match \ markNode} \ {\tt O} \ c \ {\tt with} \\
        Success -> traverse ps cs k; true
16
       | Failure -> false
17
```



# Backup Slides

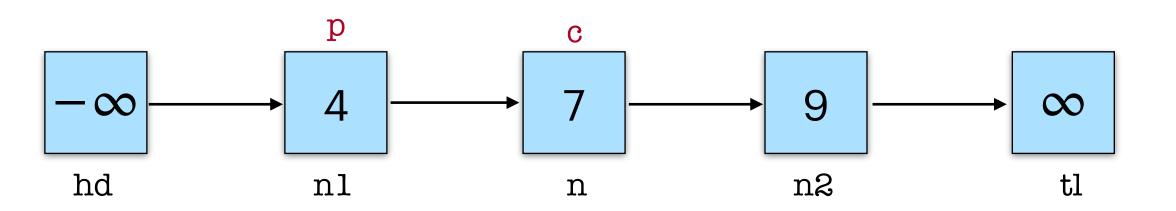
```
1 let search k =
                                           18 let insert k =
_2 let ps = allocArr L hd in
                                           19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                           let cs = allocArr L tl in
   let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
   res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
                                                 match changeNext 0 p c e with
   let p, c, res = traverse ps cs k in
                                                | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```

delete(7)



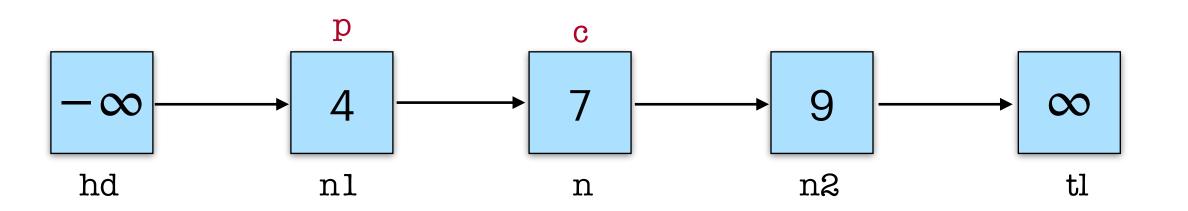
```
1 let search k =
                                           18 let insert k =
_2 let ps = allocArr L hd in
                                           19 let ps = allocArr L hd in
_3 let cs = allocArr L tl in
                                           let cs = allocArr L tl in
  let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
  res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
   let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                                | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```





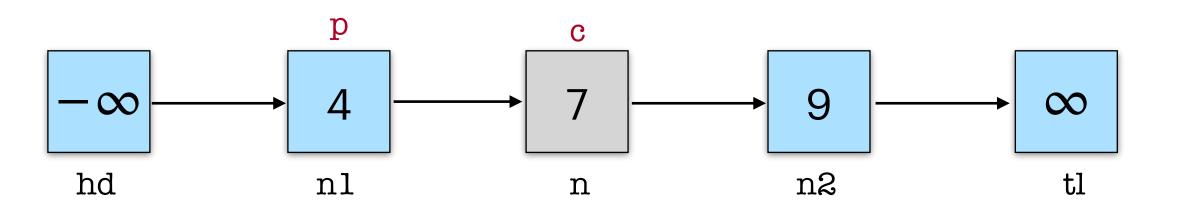
```
1 let search k =
                                           18 let insert k =
_2 let ps = allocArr L hd in
                                           19 let ps = allocArr L hd in
                                           let cs = allocArr L tl in
_3 let cs = allocArr L tl in
  let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
   res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
   let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                                 | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```





```
1 let search k =
                                           18 let insert k =
_2 let ps = allocArr L hd in
                                           19 let ps = allocArr L hd in
                                           let cs = allocArr L tl in
_3 let cs = allocArr L tl in
  let _, _, res = traverse ps cs k in
                                               let p, c, res = traverse ps cs k in
                                               if res then
   res
                                                 false
7 let delete k =
                                               else
8 let ps = allocArr L hd in
                                                 let h = randomNum L in
9 let cs = allocArr L tl in
                                                 let e = createNode k h cs in
   let p, c, res = traverse ps cs k in
                                                 match changeNext 0 p c e with
                                                 | Success ->
   if not res then
     false
                                                maintainanceOp_ins k ps cs e; true
                                                | Failure -> insert k
   else
     maintainanceOp_del c;
     match markNode 0 c with
     | Success -> traverse ps cs k; true
     | Failure -> false
17
```





```
1 let maintainanceOp_del_rec i h pm c =
2    if i < h-1 then
3        let idx = pm[i] in
4        markNode idx c;
5        maintainanceOp_del_rec (i+1) h pm c
6    else
7        ()
8
9 let maintainanceOp_del c =
10    let h = getHeight c in
11    let pm = permute h in
12    maintainanceOp_del 0 h pm c</pre>
```

```
13 let maintainanceOp_ins_rec i\ h\ pm\ ps\ cs\ e =
if i < h-1 then
   let idx = pm[i] in
15
   let p = ps[idx] in
16
let c = cs[idx] in
     match changeNext idx p c e with
18
     | Success ->
19
       maintainanceOp_ins_rec (i+1) h pm ps cs e
20
      | Failure ->
21
       traverse ps cs k;
22
       	exttt{maintainanceOp\_ins\_rec} i h pm ps cs e
23
    else
24
      ()
25
26
27 let maintainanceOp_ins k ps cs e =
    let h = getHeight e in
    let pm = permute h in
    {\tt maintainanceOp\_ins} O h pm ps cs e
```

```
\rightarrow 1 let eager_i i \ k \ p \ c =
   2 match findNext i c with
     | cn, true ->
        match changeNext i p c cn with
       | Success -> eager_i i k p cn
       | Failure -> traverse ps cs k
     | cn, false ->
        let kc = getKey c in
        if kc < k then
        	exttt{eager_i} \ i \ k \ c \ cn
  10
        else
  11
          let res = (kc = k ? true : false) in
  12
         (p, c, res)
  13
```

```
let eager_rec i ps cs k =

let p = ps[i+1] in

let c, _ = findNext i p in

let p', c', res = eager_i i k p c in

ps[i] \leftarrow p';

cs[i] \leftarrow c';

cs[i] \leftarrow c';

if i = 0 then

(p', c', res)

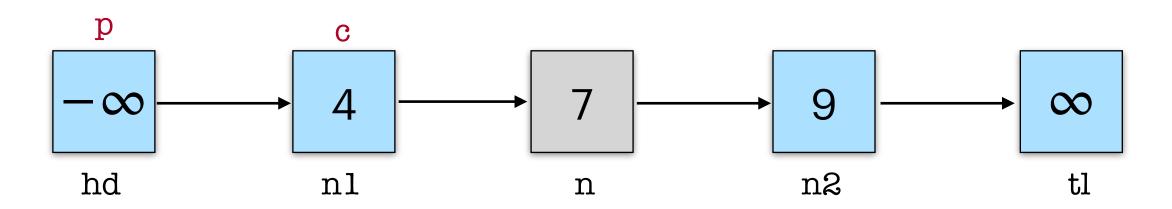
else

a eager_rec (i-1) ps cs k

let traverse ps cs k =

eager_rec (L-2) ps cs k
```

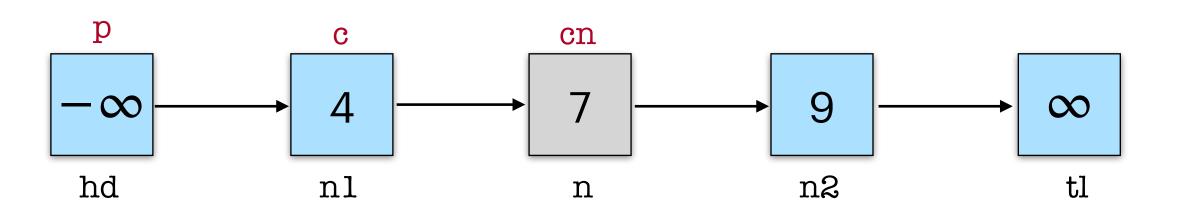




```
1 let eager_i i k p c =
                                              14 let eager_rec i ps cs k =
                                             15 let p = ps[i+1] in

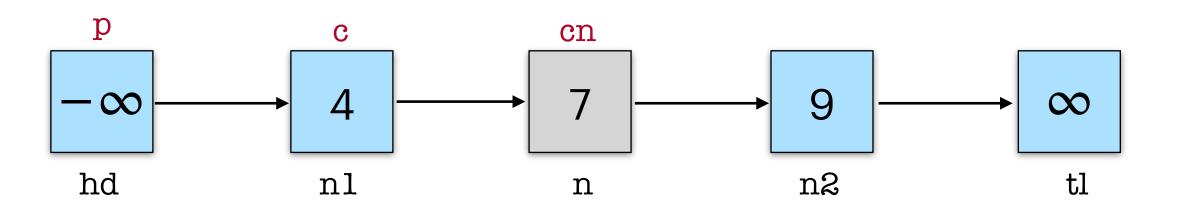
ightharpoonup 2 match findNext i c with
 3 | cn, true ->
                                              let c, _ = findNext i p in
      match changeNext i p c cn with
                                              let p', c', res = eager_i i k p c in
      | Success -> eager_i i k p cn
                                              ps[i] \leftarrow p';
      | Failure -> traverse ps cs k
                                              cs[i] \leftarrow c';
    | cn, false ->
                                              if i = 0 then
      let kc = getKey c in
                                              (p', c', res)
      if kc < k then
                                              22 else
      	exttt{eager_i} i k c cn
 10
                                                 eager_rec (i-1) ps cs k
      else
 11
        let res = (kc = k ? true : false) in
 12
                                              25 let traverse ps cs k =
        (p, c, res)
13
                                              eager_rec (L - 2) ps cs k
```





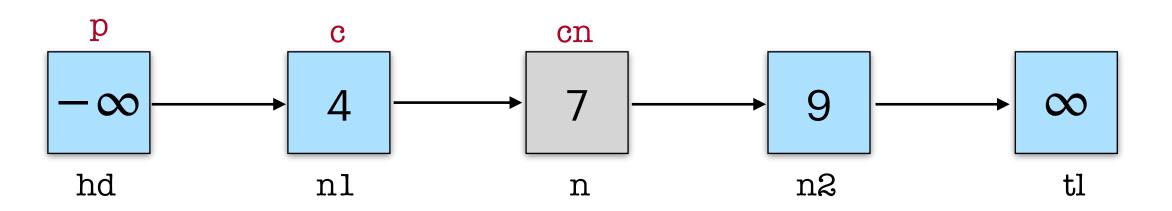
```
1 let eager_i i k p c =
                                                14 let eager_rec i ps cs k =
                                               15 let p = ps[i+1] in
  2 match findNext i c with
     | cn, true ->
                                                let c, _ = findNext i p in
       match changeNext i p c cn with
                                                let p', c', res = eager_i i k p c in
       | Success -> eager_i i k p cn
                                                ps[i] \leftarrow p';
       | Failure -> traverse ps cs k
                                                cs[i] \leftarrow c';
\rightarrow 7 | cn, false \rightarrow
                                                if i = 0 then
       let kc = getKey c in
                                                (p', c', res)
       if kc < k then
                                                22 else
       	exttt{eager_i} \ i \ k \ c \ cn
 10
                                                   eager_rec (i-1) ps cs k
       else
 11
         let res = (kc = k ? true : false) in
 12
                                                25 let traverse ps cs k =
         (p, c, res)
 13
                                                eager_rec (L - 2) ps cs k
```





```
1 let eager_i i k p c =
                                              14 let eager_rec i ps cs k =
                                              15 let p = ps[i+1] in
  2 match findNext i c with
     | cn, true ->
                                              let c, _ = findNext i p in
       match changeNext i p c cn with
                                              let p', c', res = eager_i i k p c in
      | Success -> eager_i i k p cn
                                              ps[i] \leftarrow p';
      | Failure -> traverse ps cs k
                                              cs[i] \leftarrow c';
     | cn, false ->
                                              if i = 0 then
       let kc = getKey c in
                                              (p', c', res)
       if kc < k then
                                              22 else
       	exttt{eager_i} \ i \ k \ c \ cn
10
                                                  eager_rec (i-1) ps cs k
       else
 11
         let res = (kc = k ? true : false) in
 12
                                              25 let traverse ps cs k =
        (p, c, res)
 13
                                              eager_rec (L - 2) ps cs k
```





```
\rightarrow 1 let eager_i i \ k \ p \ c =
   2 match findNext i c with
     | cn, true ->
        match changeNext i p c cn with
       | Success -> eager_i i k p cn
       | Failure -> traverse ps cs k
     | cn, false ->
        let kc = getKey c in
        if kc < k then
        	exttt{eager_i} \ i \ k \ c \ cn
  10
        else
  11
          let res = (kc = k ? true : false) in
  12
         (p, c, res)
  13
```

```
let eager_rec i ps cs k =

let p = ps[i+1] in

let c, _ = findNext i p in

let p', c', res = eager_i i k p c in

ps[i] \leftarrow p';

cs[i] \leftarrow c';

cs[i] \leftarrow c';

if i = 0 then

(p', c', res)

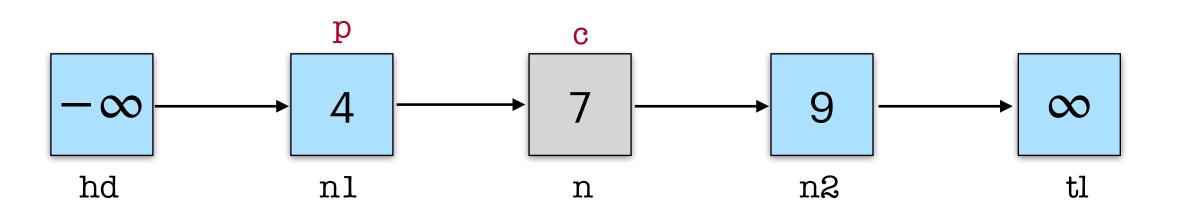
else

a eager_rec (i-1) ps cs k

let traverse ps cs k =

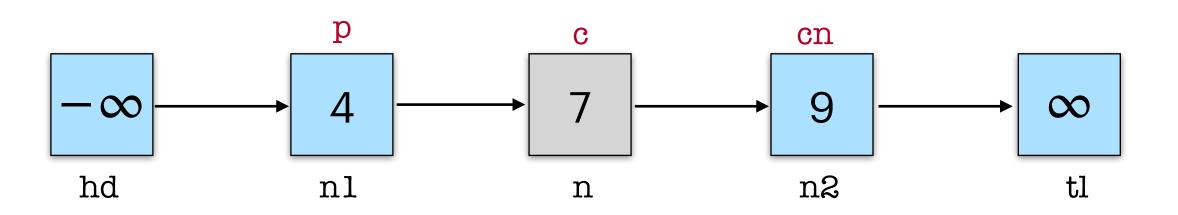
eager_rec (L-2) ps cs k
```





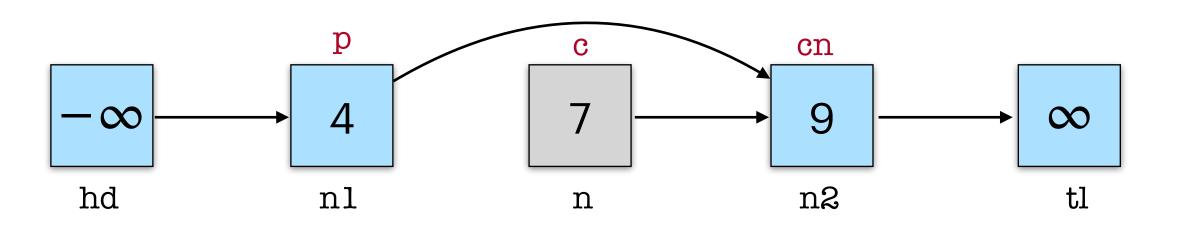
```
1 let eager_i i k p c =
                                            14 let eager_rec i ps cs k =
                                            15 let p = ps[i+1] in
   match findNext i c with
   | cn, true ->
                                            let c, _ = findNext i p in
     match changeNext i p c cn with
                                            let p', c', res = eager_i i k p c in
    | Success -> eager_i i k p cn
                                            ps[i] \leftarrow p';
     | Failure -> traverse ps cs k
                                            cs[i] \leftarrow c';
    | cn, false ->
                                            if i = 0 then
     let kc = getKey c in
                                            (p', c', res)
     if kc < k then
                                            22 else
     	exttt{eager_i} \ i \ k \ c \ cn
10
                                                eager_rec (i-1) ps cs k
     else
11
       let res = (kc = k ? true : false) in
12
                                             25 let traverse ps cs k =
       (p, c, res)
13
                                             eager_rec (L - 2) ps cs k
```





```
1 let eager_i i k p c =
                                             14 let eager_rec i ps cs k =
                                            15 let p = ps[i+1] in
   match findNext i c with
    | cn, true ->
                                             let c, _ = findNext i p in
     match changeNext i p c cn with
                                             let p', c', res = eager_i i k p c in
     | Success -> eager_i i k p cn
                                             ps[i] \leftarrow p';
     | Failure -> traverse ps cs k
                                             cs[i] \leftarrow c';
   | cn, false ->
                                             if i = 0 then
     let kc = getKey c in
                                             (p', c', res)
     if kc < k then
                                             22 else
     	exttt{eager_i} \ i \ k \ c \ cn
10
                                                 eager_rec (i-1) ps cs k
     else
11
       let res = (kc = k ? true : false) in
12
                                             25 let traverse ps cs k =
       (p, c, res)
13
                                             eager_rec (L - 2) ps cs k
```

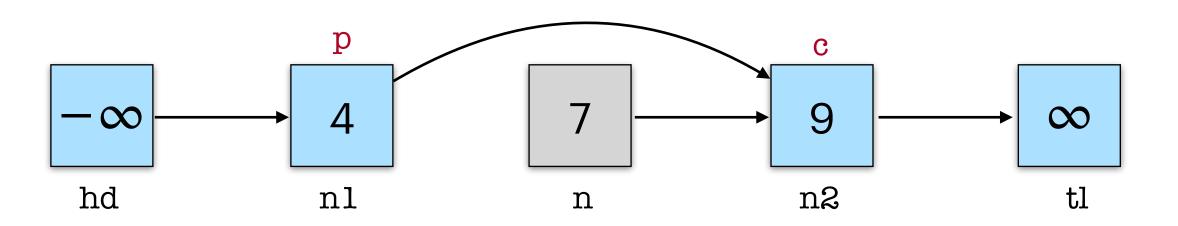




```
\rightarrow 1 let eager_i i \ k \ p \ c =
   2 match findNext i c with
     | cn, true ->
        match changeNext i p c cn with
        | Success -> eager_i i k p cn
       | Failure -> traverse ps cs k
      | cn, false ->
        let kc = getKey c in
        if kc < k then
        	exttt{eager_i} \ i \ k \ c \ cn
  10
        else
  11
          let res = (kc = k ? true : false) in
  12
         (p, c, res)
  13
```

```
14 let eager_rec i ps cs k =
15   let p = ps[i+1] in
16  let c, _ = findNext i p in
17  let p', c', res = eager_i i k p c in
18  ps[i] <- p';
19  cs[i] <- c';
20  if i = 0 then
21   (p', c', res)
22  else
23  eager_rec (i-1) ps cs k
24
25 let traverse ps cs k =
26  eager_rec (L - 2) ps cs k</pre>
```





```
1 let eager_i i k p c =
     match findNext i c with
     | cn, true ->
       match changeNext i p c cn with
       | Success -> eager_i i k p cn
       | Failure -> traverse ps cs k
      | cn, false ->
       let kc = getKey c in
       if kc < k then
       	exttt{eager_i} \ i \ k \ c \ cn
 10
       else
 11
         let res = (kc = k ? true : false) in
12
         (p, c, res)
 13
```

```
let eager_rec i ps cs k =

let p = ps[i+1] in

let c, _ = findNext i p in

let p', c', res = eager_i i k p c in

ps[i] \leftarrow p';

cs[i] \leftarrow c';

cs[i] \leftarrow c';

if i = 0 then

(p', c', res)

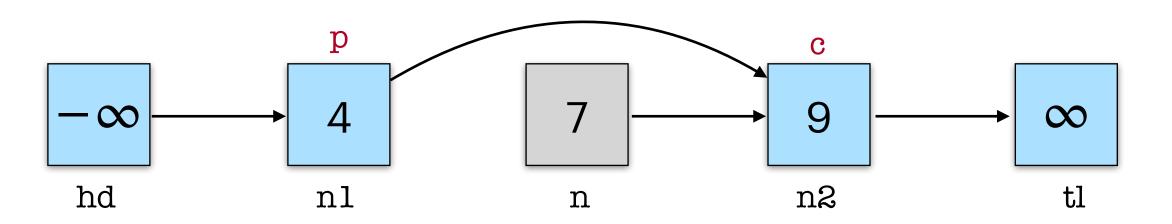
else

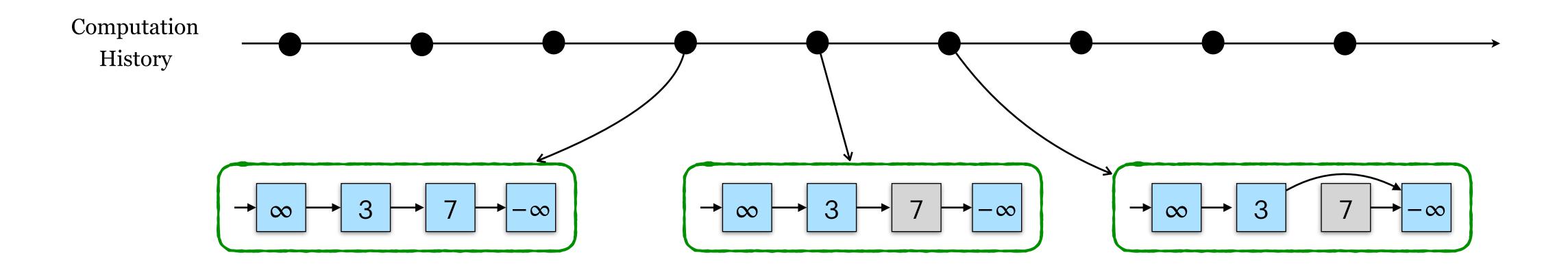
a eager_rec (i-1) ps cs k

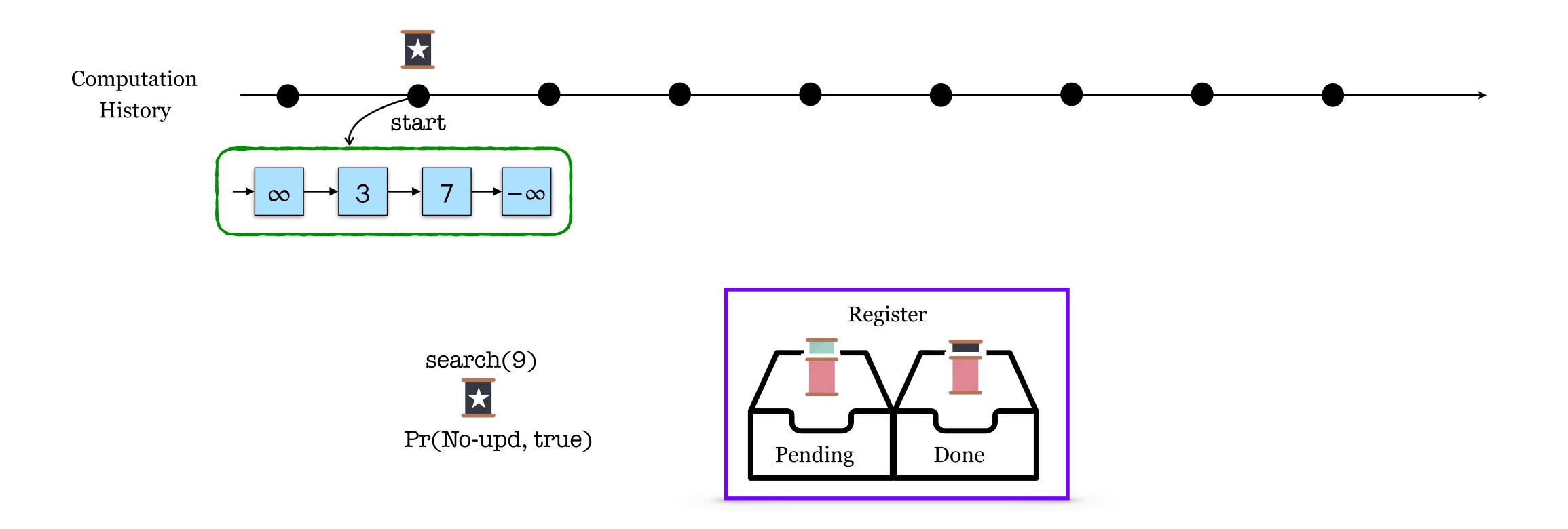
let traverse ps cs k =

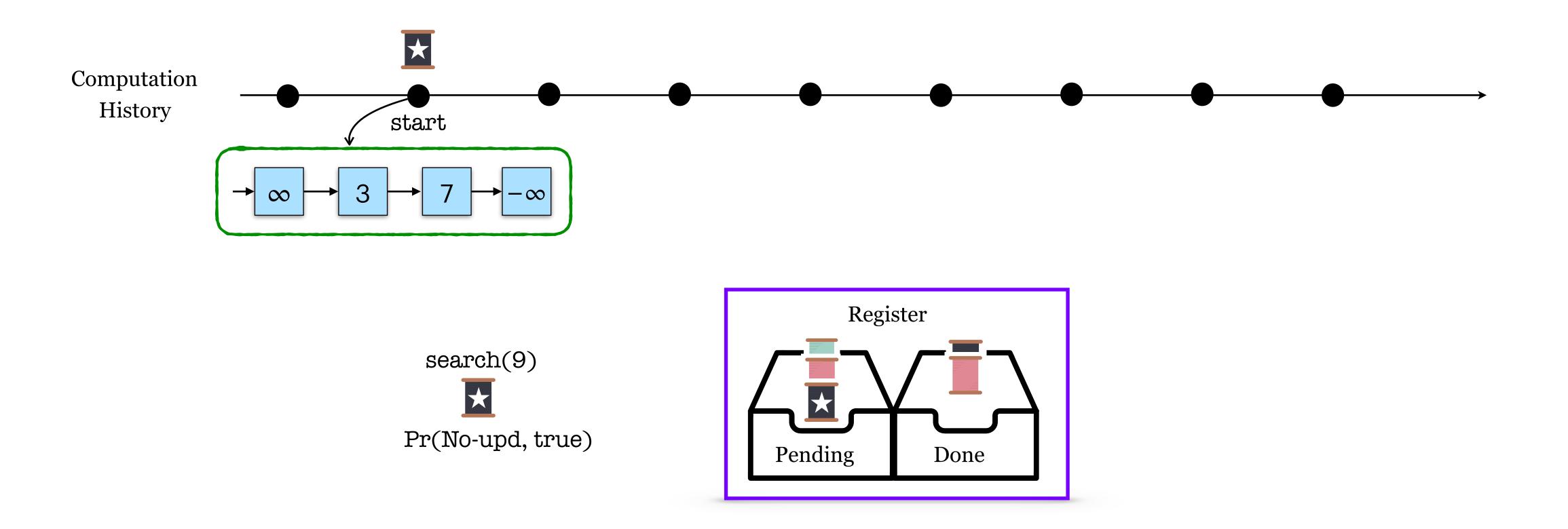
eager_rec (L-2) ps cs k
```

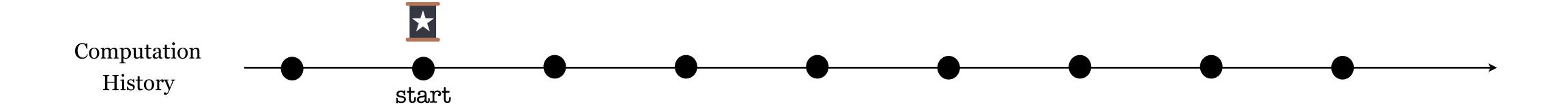


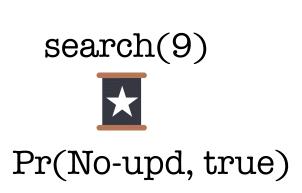


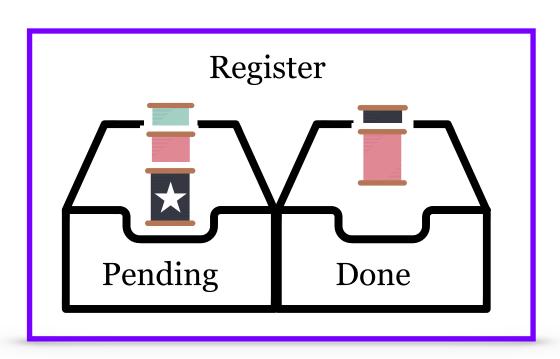


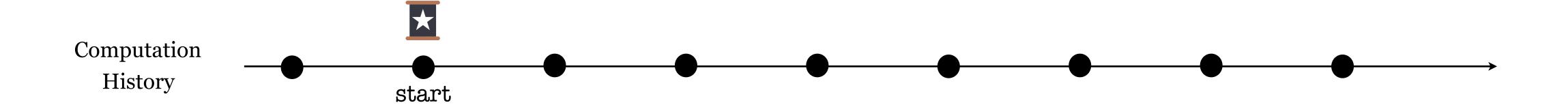


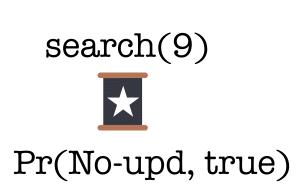


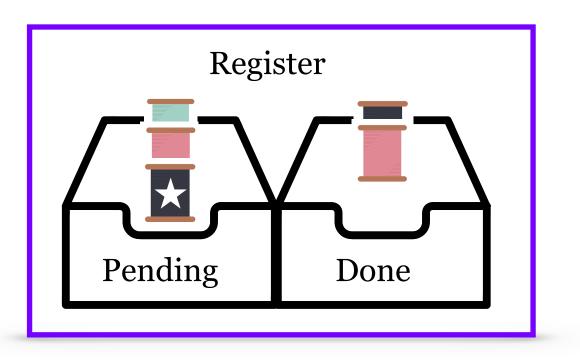


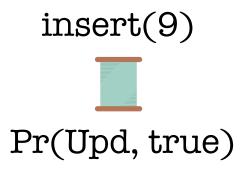


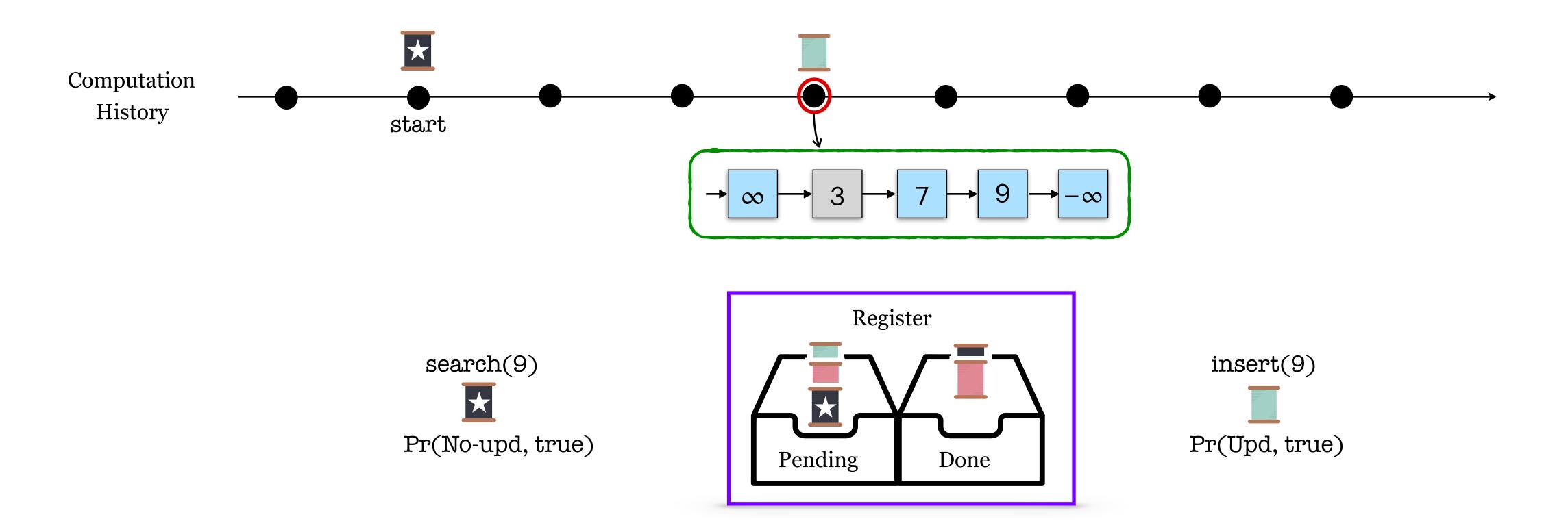


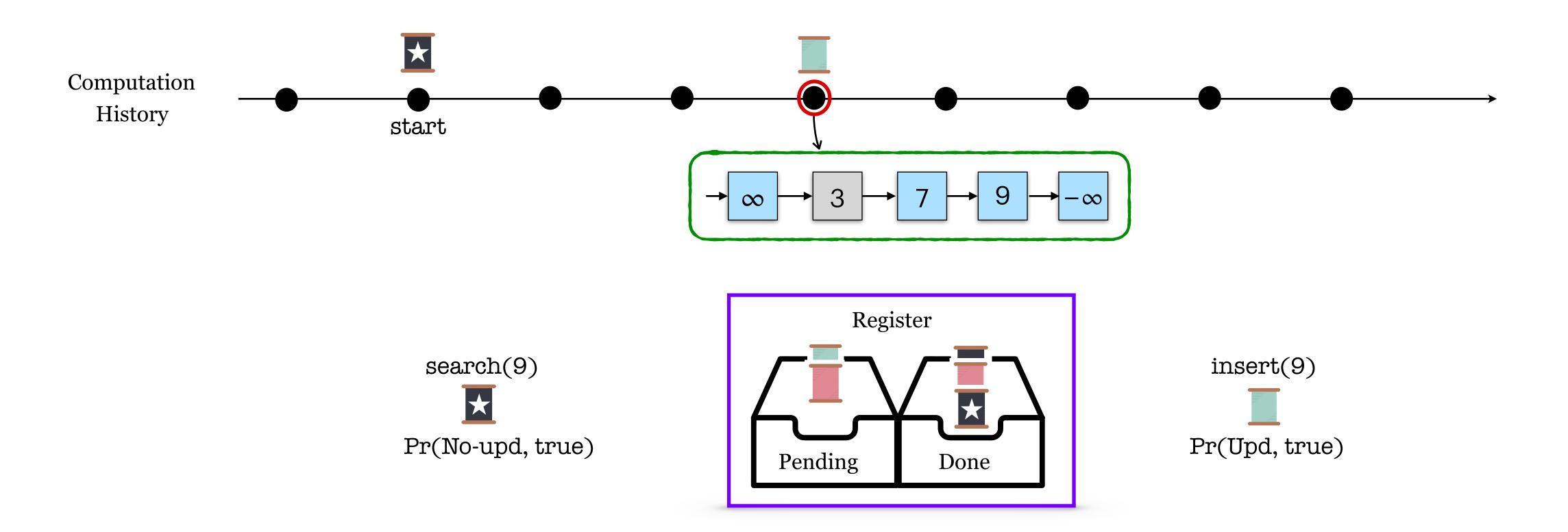


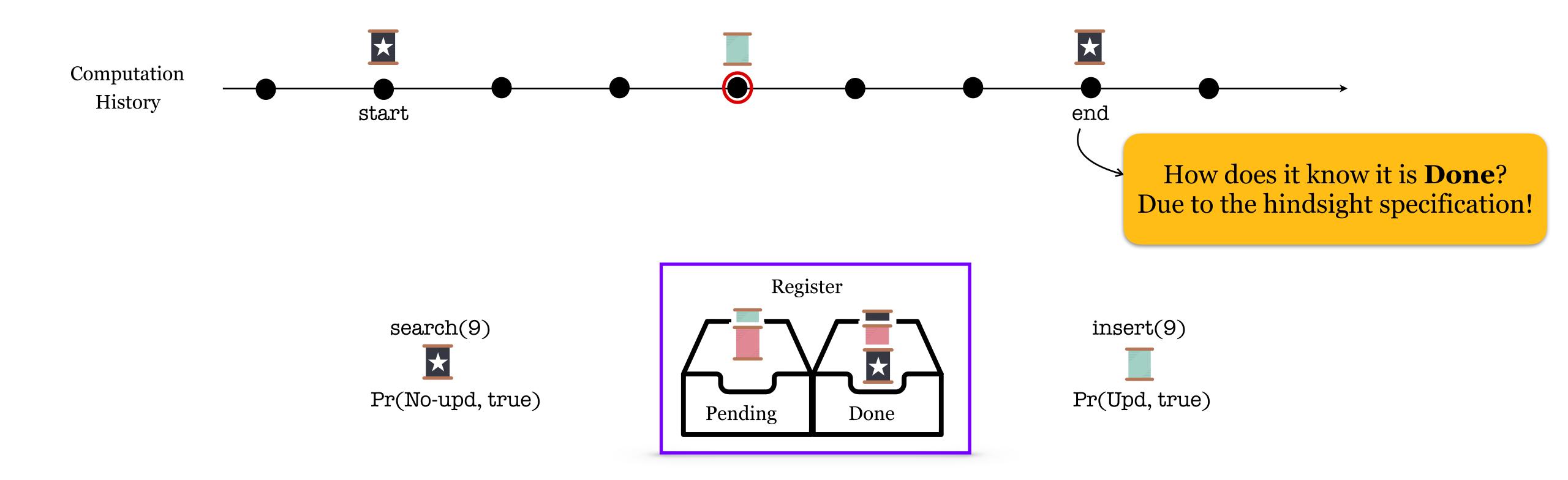












#### Hindsight Framework

Hindsight

Specification

Data Structure invariants

Prophecy variables

Client-level Specification

Proof of the method

Helping Protocol

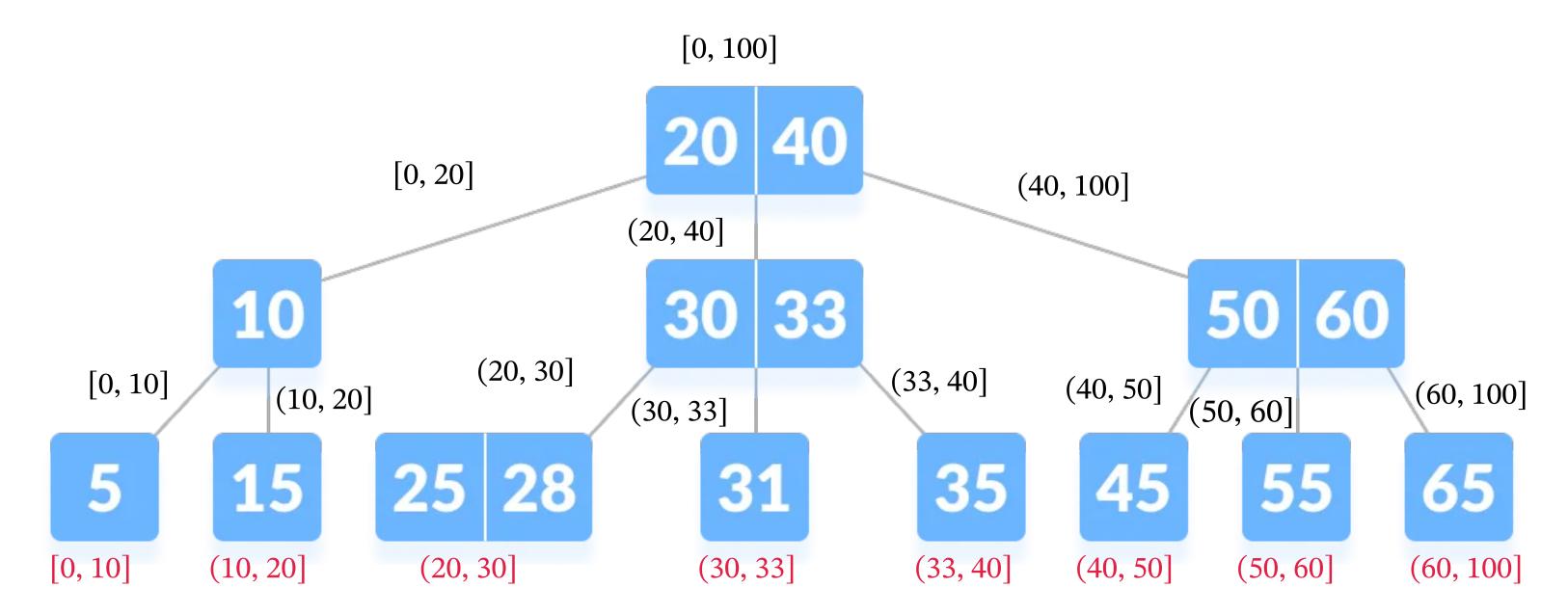
#### **Hindsight Specification:**

• Precondition : Modifying LP —— Postcondition : Receipt of linearization

• Precondition: Unmodifying LP  $\longrightarrow$  Postcondition: at some point during the execution,  $\Psi(op, k, C, C', res)$  was true

Framework provides:	Proof author obligations:	
• Prophecy instantiation	• Determine steps that potentially change the abstract state	
• Helping protocol	• Define a "snapshot" of the data structure and provide invariants	
<ul> <li>Mechanism for storing history of computation</li> </ul>	• Prove the hindsight specification for each operation	

#### Keysets



$$k \in \text{keyset}(n) \rightarrow (k \in C(n) \leftrightarrow k \in C)$$

Expressed using the Flow Framework [POPL18, ESOP20, PLDI20]

```
1 let search k =
                                                      18 let insert k =
let search k =

let ps = \text{allocArr } L \ hd in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in

let cs = \text{allocArr } L \ tl in
                                                          22 if res then
                                                                  false
7 let delete k =
                                                               else
8 let ps = allocArr L hd in 25 let h = randomNum L in
9 let cs = allocArr L tl in 26 let e = createNode k h cs in
                                                                 match changeNext 0 p c e with
   let p, c, res = traverse ps cs k in 27
if not res then
                                                        28 | Success ->
       false
                                                         maintainanceOp_ins k ps cs e; true
                                                               | Failure -> insert k
    else
       maintainanceOp_del c;
       match markNode 0 c with
       | Success -> traverse ps cs k; true
       | Failure -> false
17
```

#### Approach:

- 1. Verify the templates assuming the specification traverse, maintenance and helper functions.
- 2. Instantiate traverse, etc. and show they satisfy the required specifications.

```
{ Node(n, k, m, n') } markNode O n  { Node(n, k, m[O \mapsto true], n') }
```