

# Program Analysis for Overlaid Data Structures

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Queen Mary University of London

(Joint work with Oukseh Lee and Rasmus Petersen)

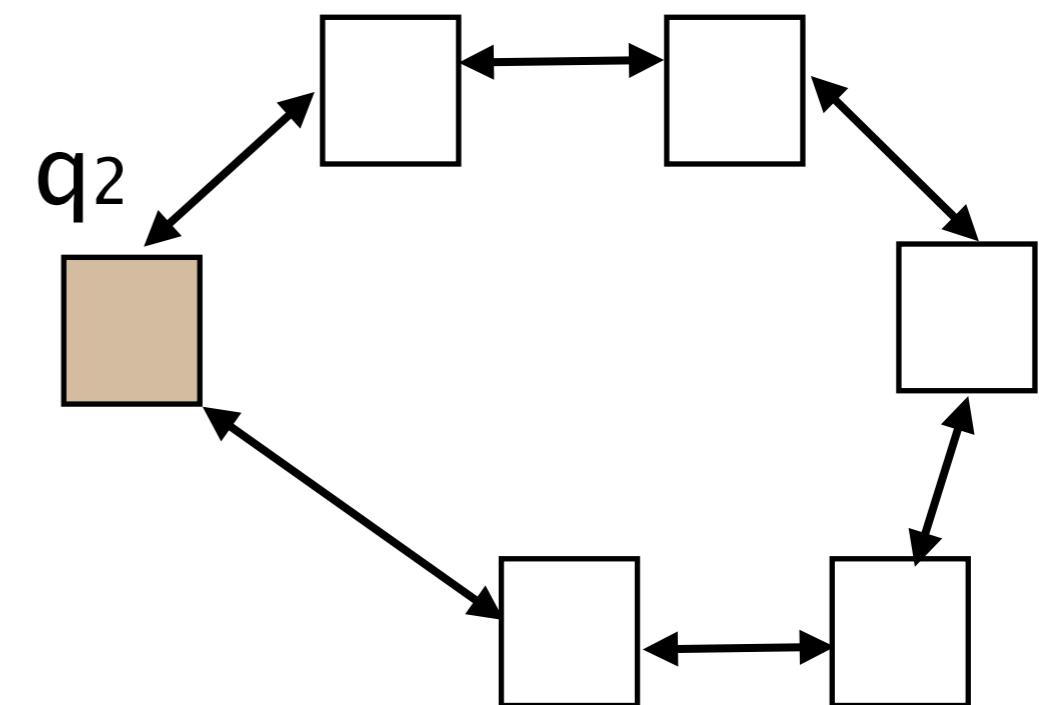
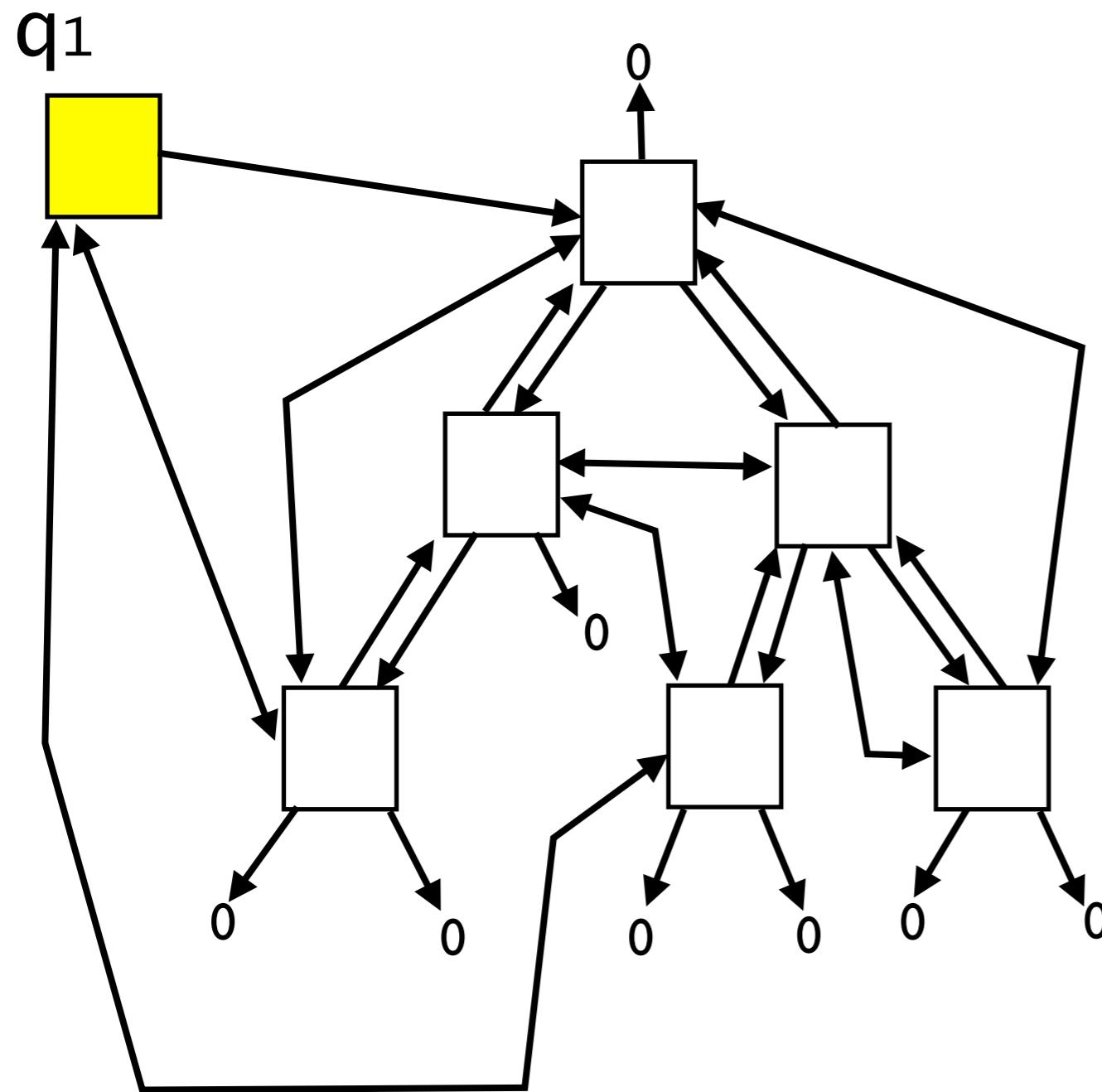
# Our goal

- Automatically verify deep heap properties (e.g., no memory leak, and preservation of shape invariant) of real-world systems code, such as Linux.
- Great progress in the past 5 years.
- Challenges:
  - Highly-shared data structures.
  - Concurrency.
  - ...

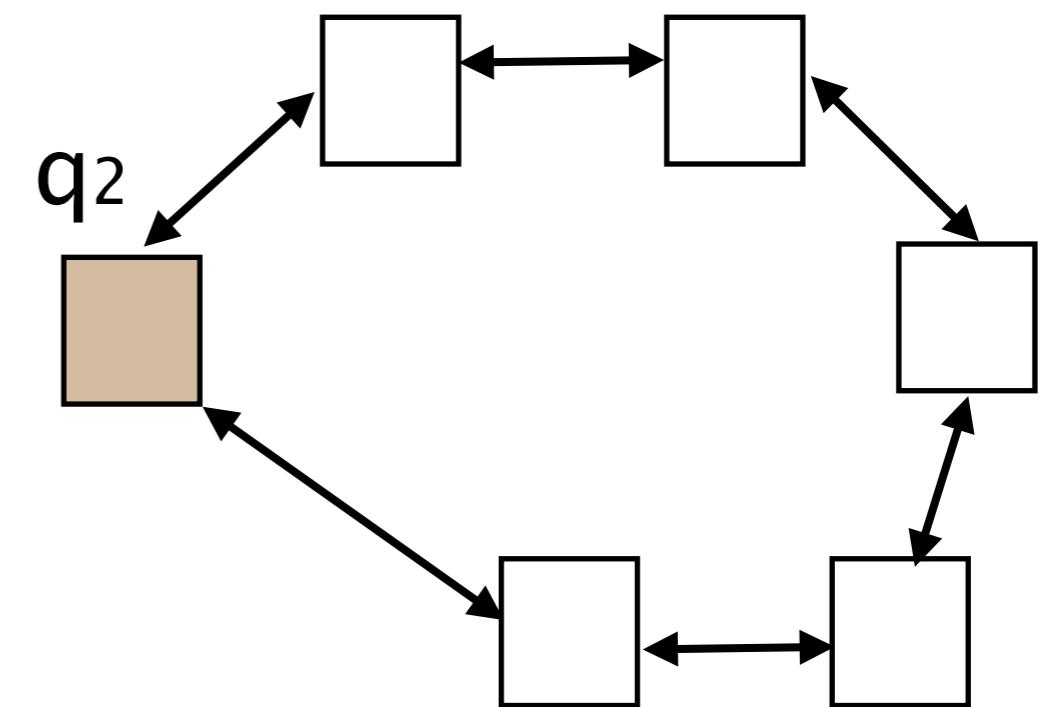
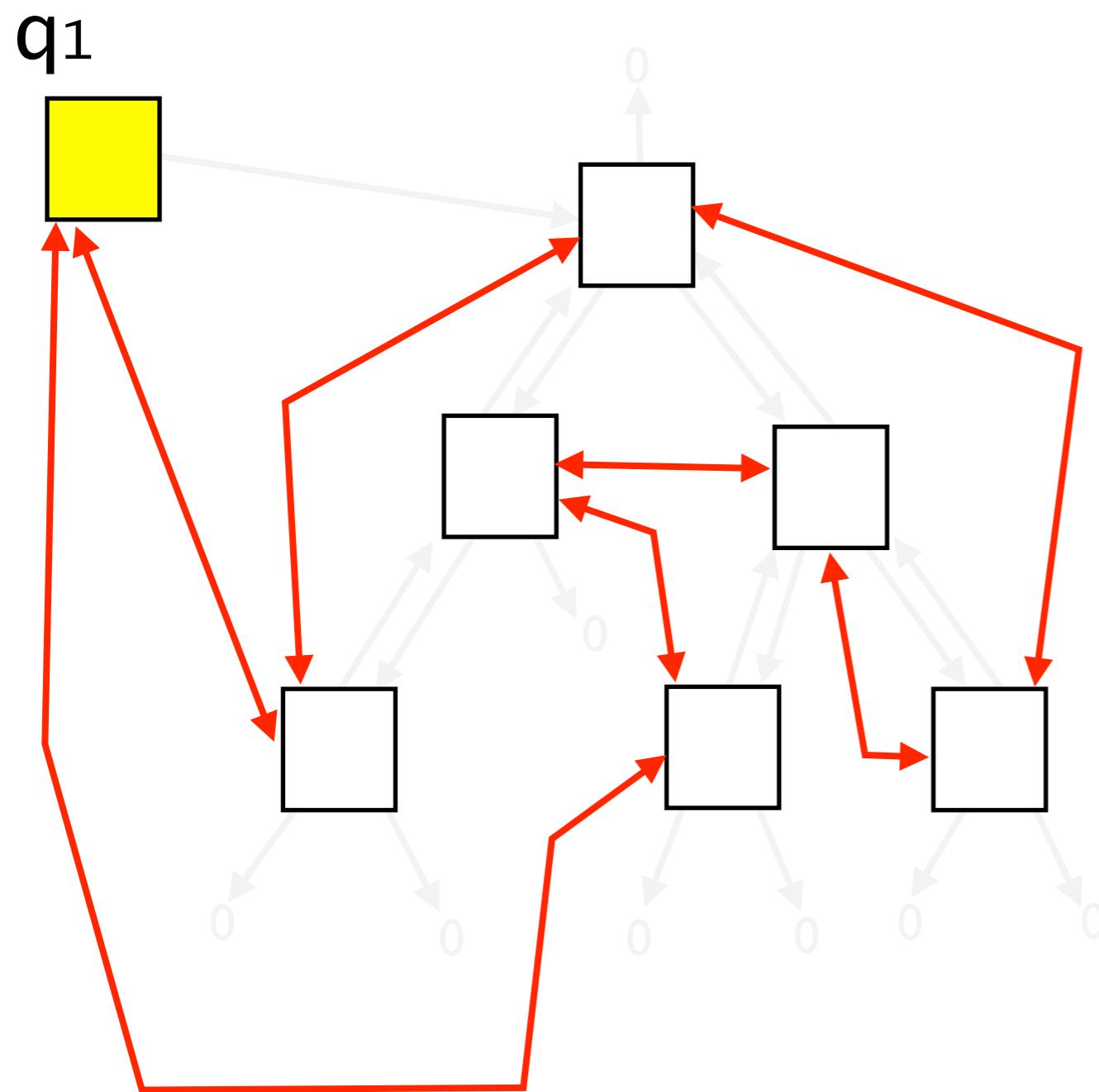
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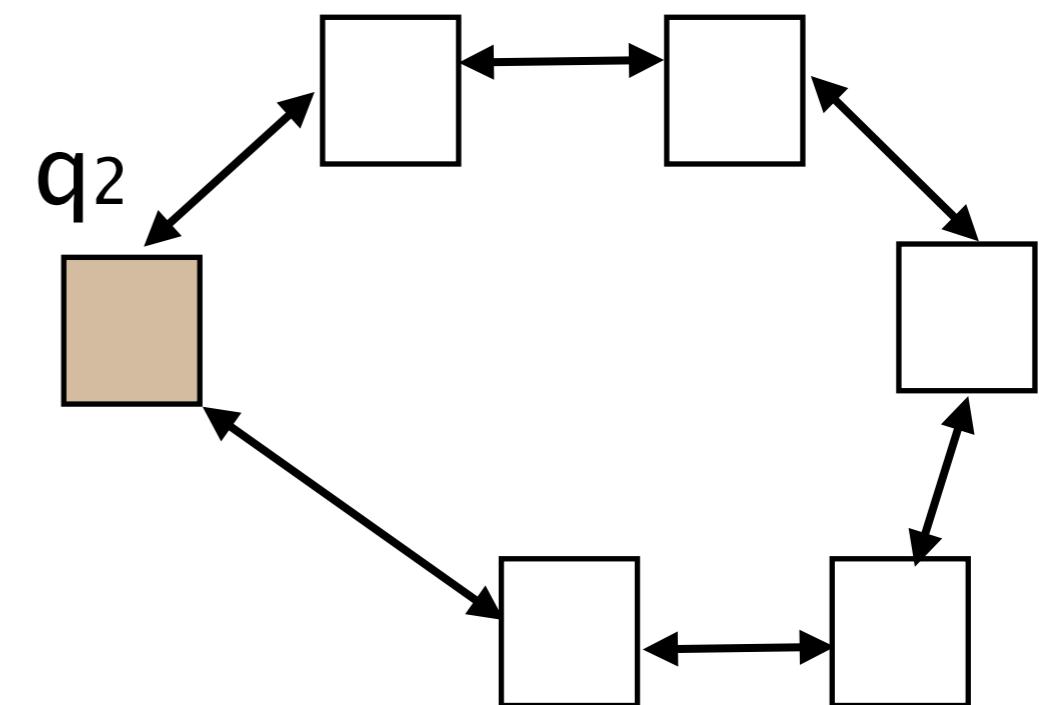
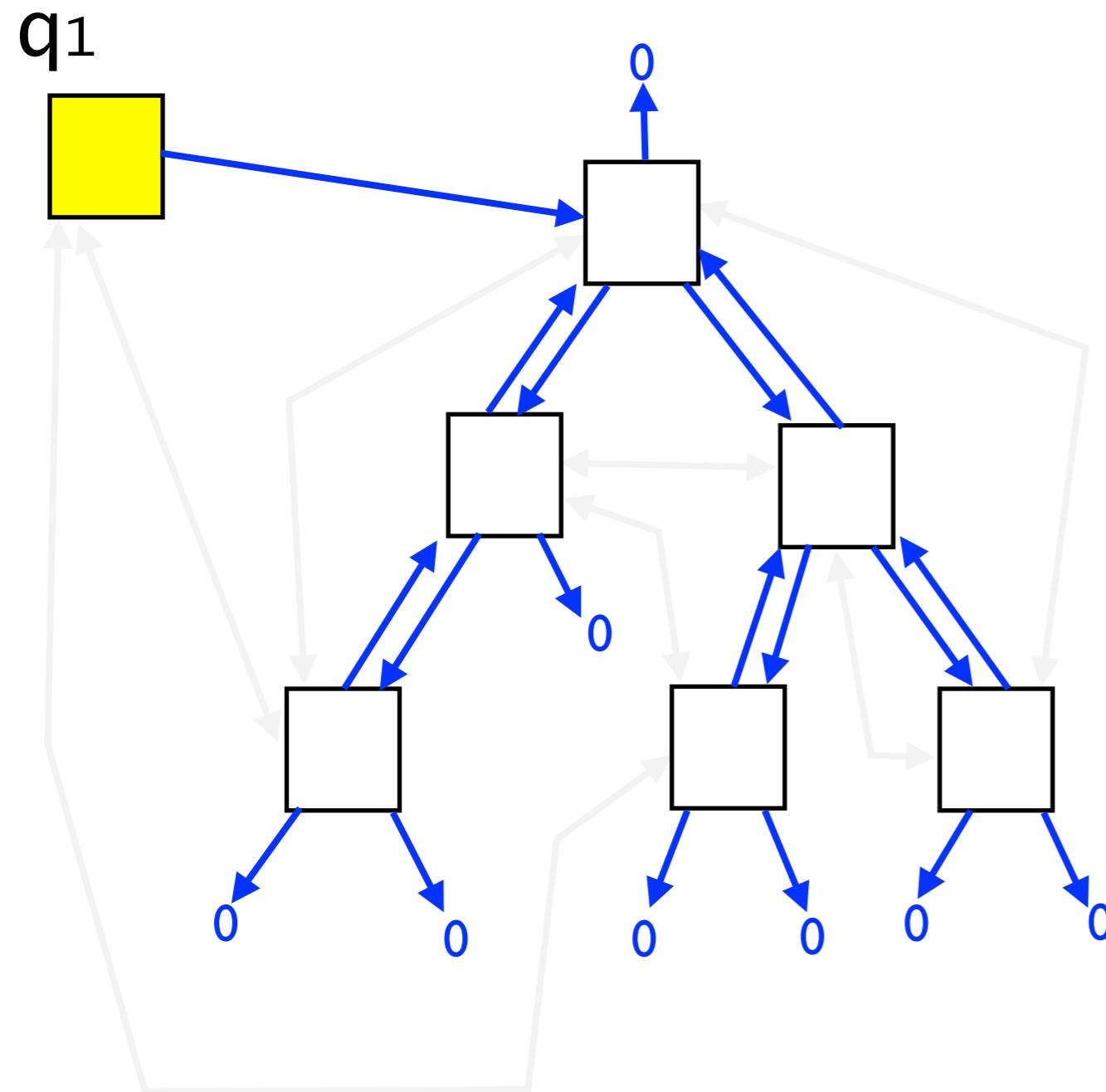
# Deadline IO scheduler



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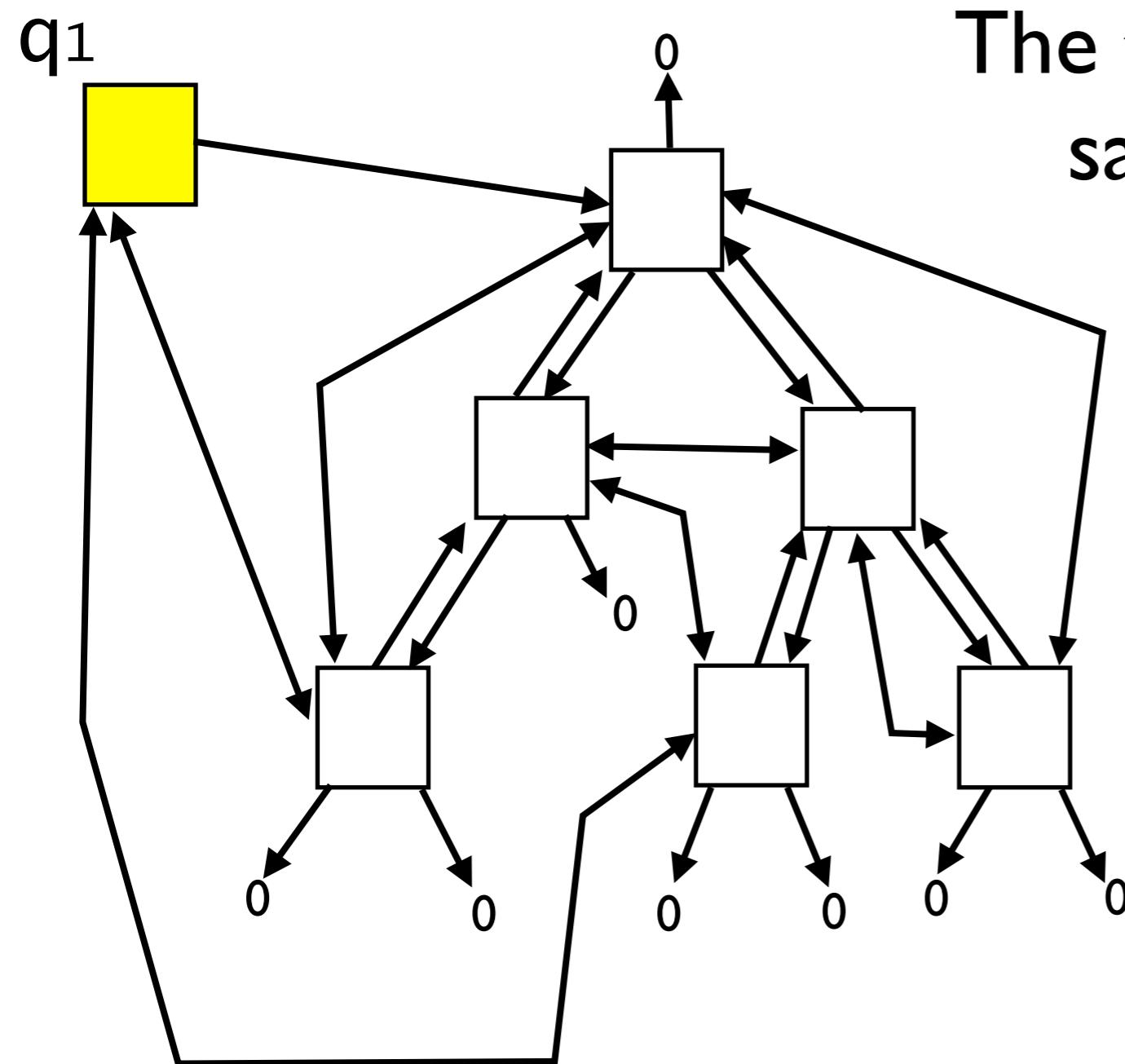
# Deadline IO scheduler



# Overlaid data structure

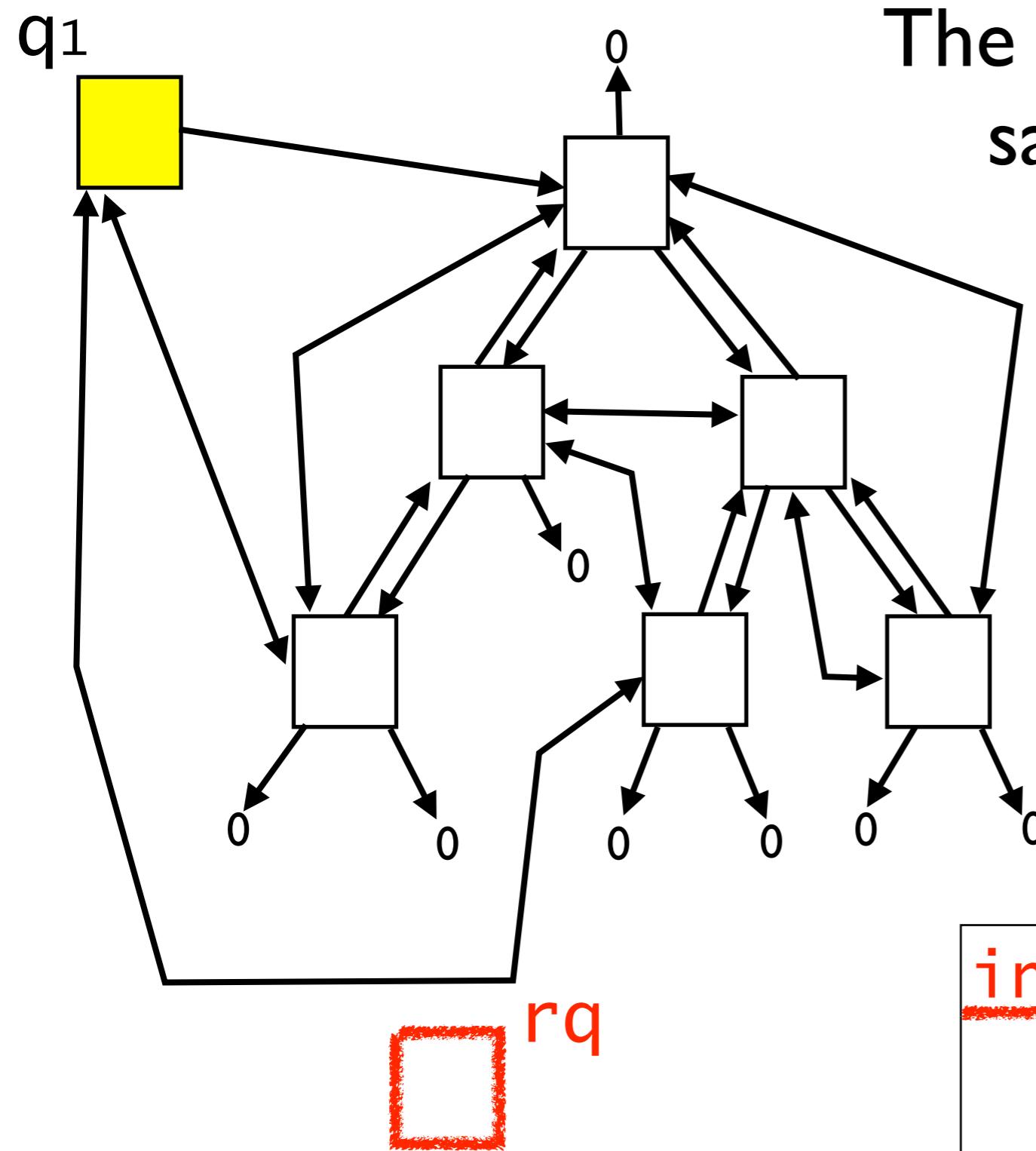
- One or more data structures on top of another.
- Frequently found in Linux.
- Components of an overlaid data structure (e.g., tree and list in the IO scheduler) are loosely correlated.
- The only important correlation is that the components talk about the same set of heap cells.

# Deadline IO scheduler

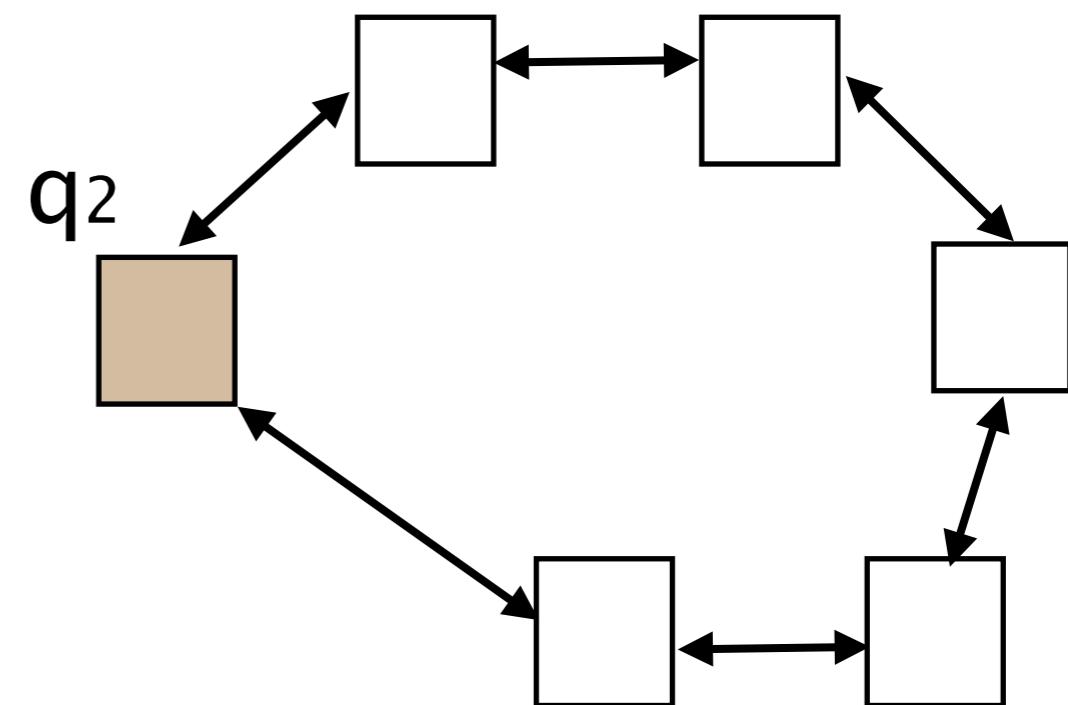


The tree and the list use the same set of heap cells.

# Insert a request

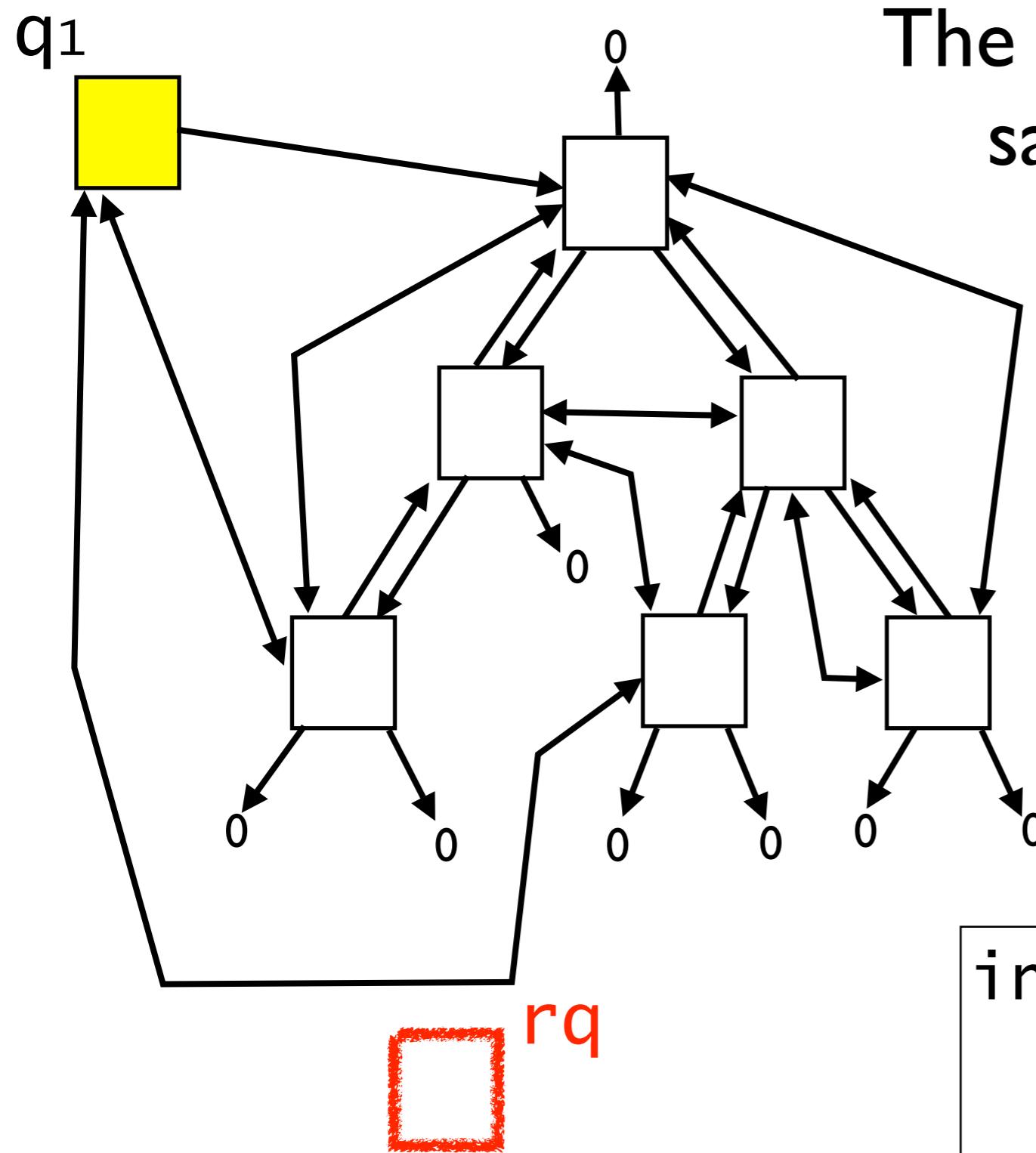


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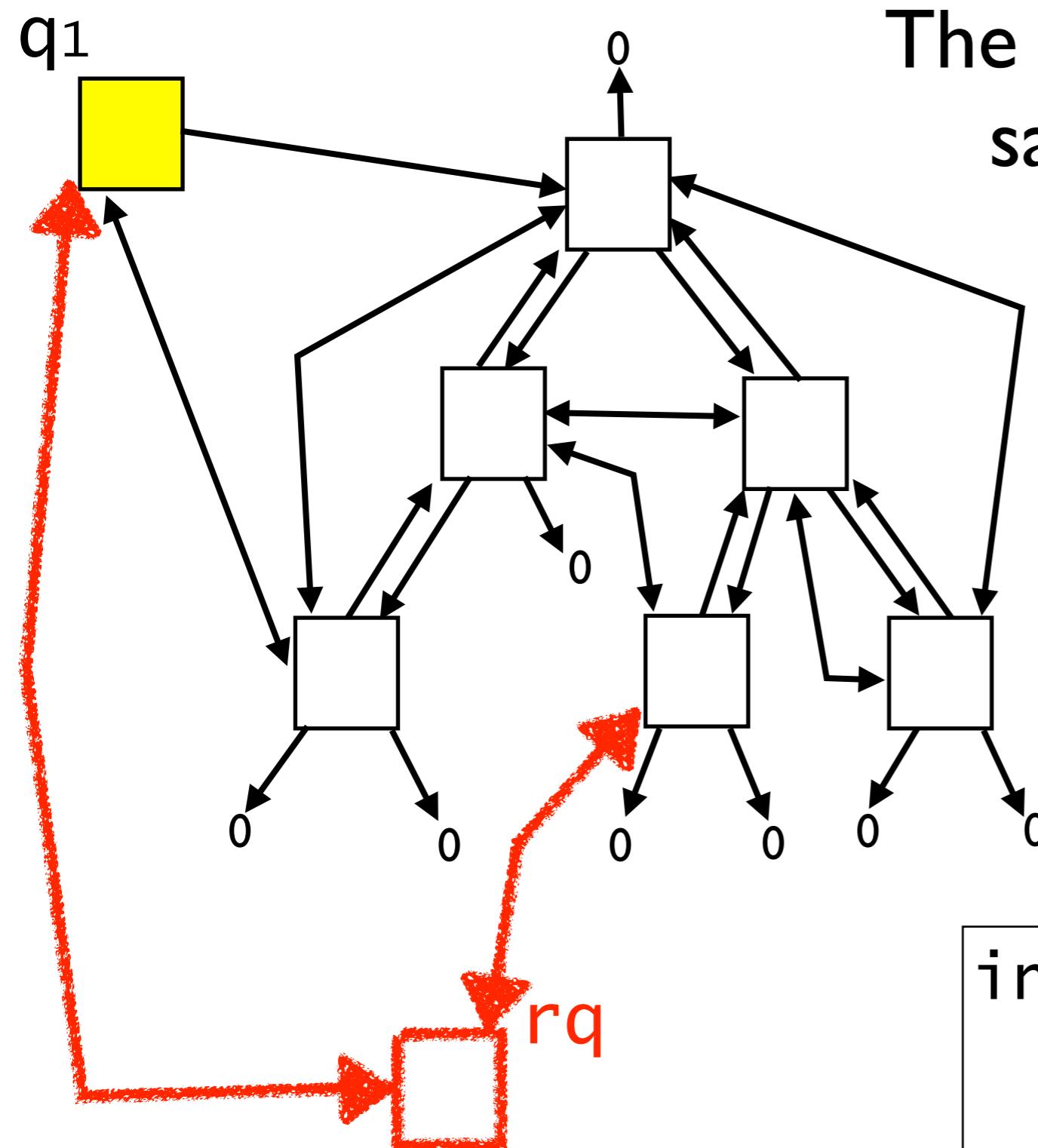
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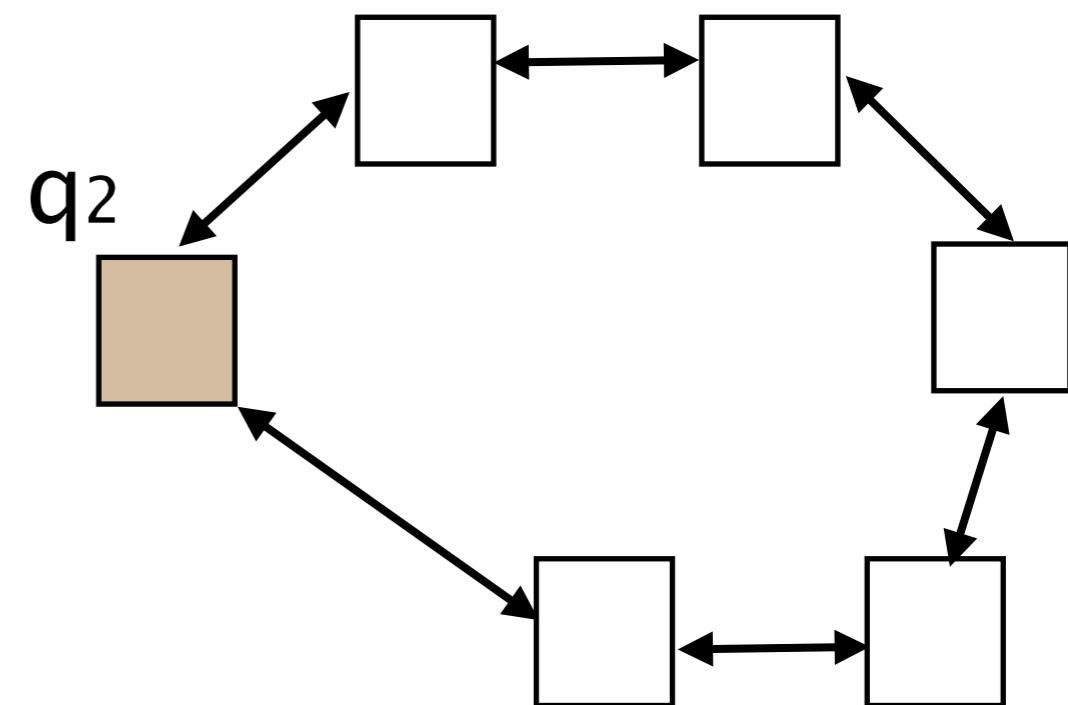


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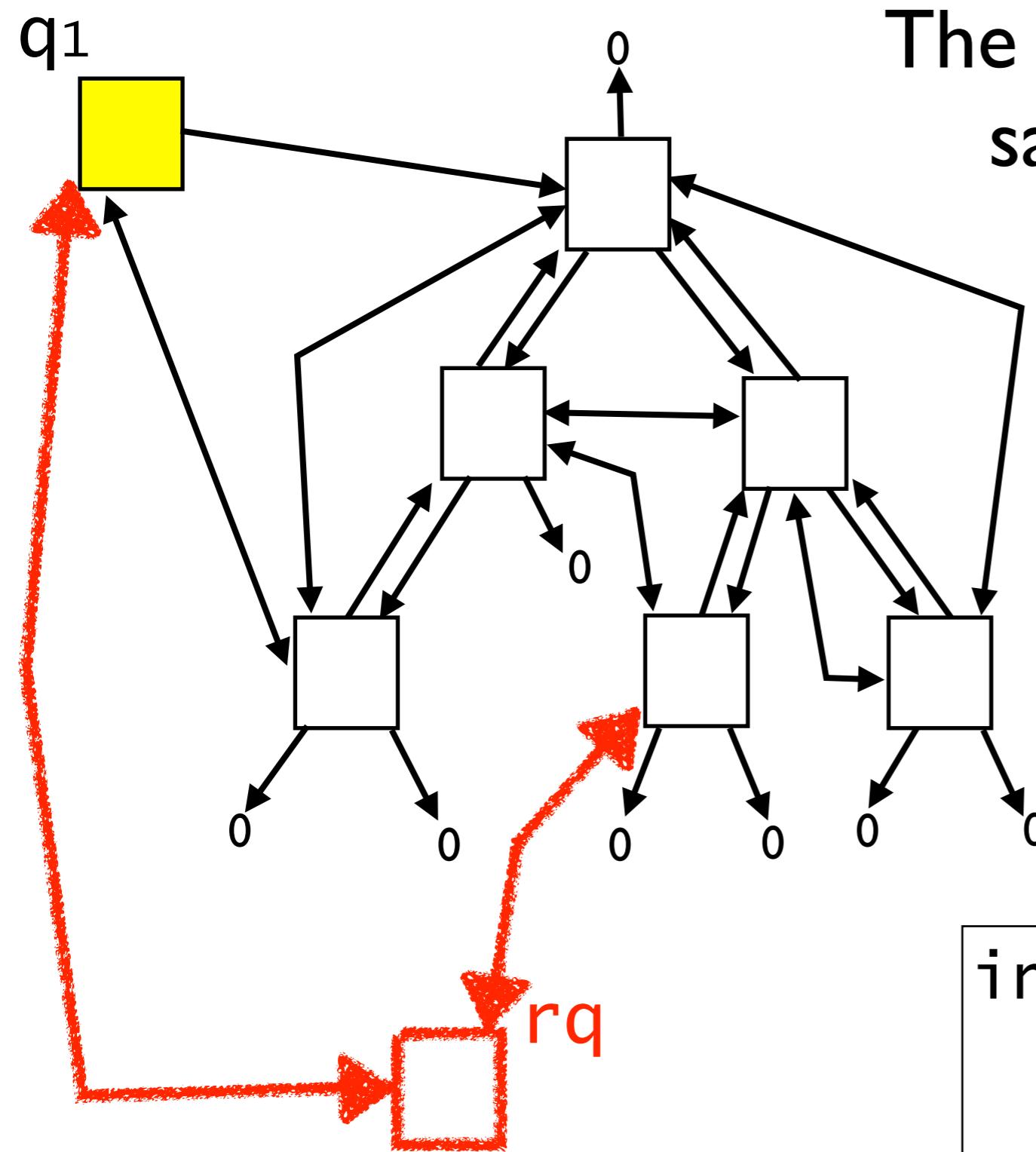


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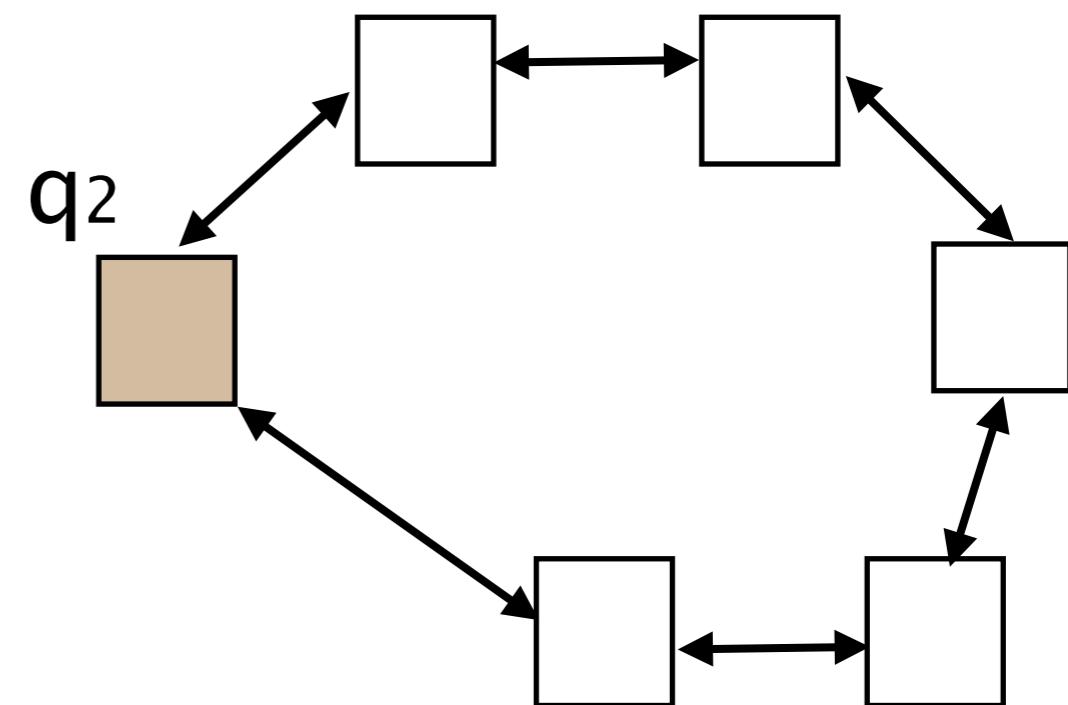


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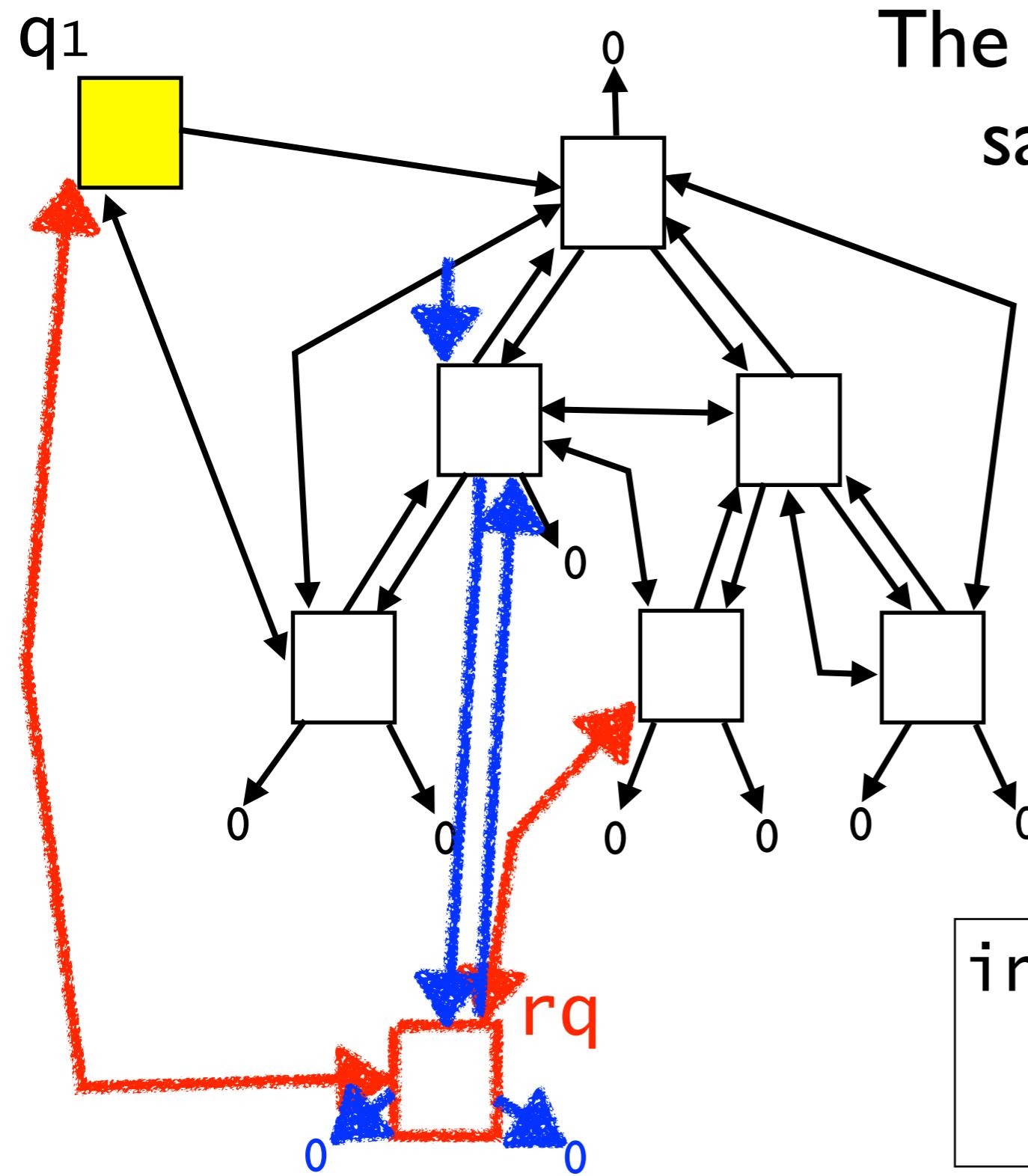


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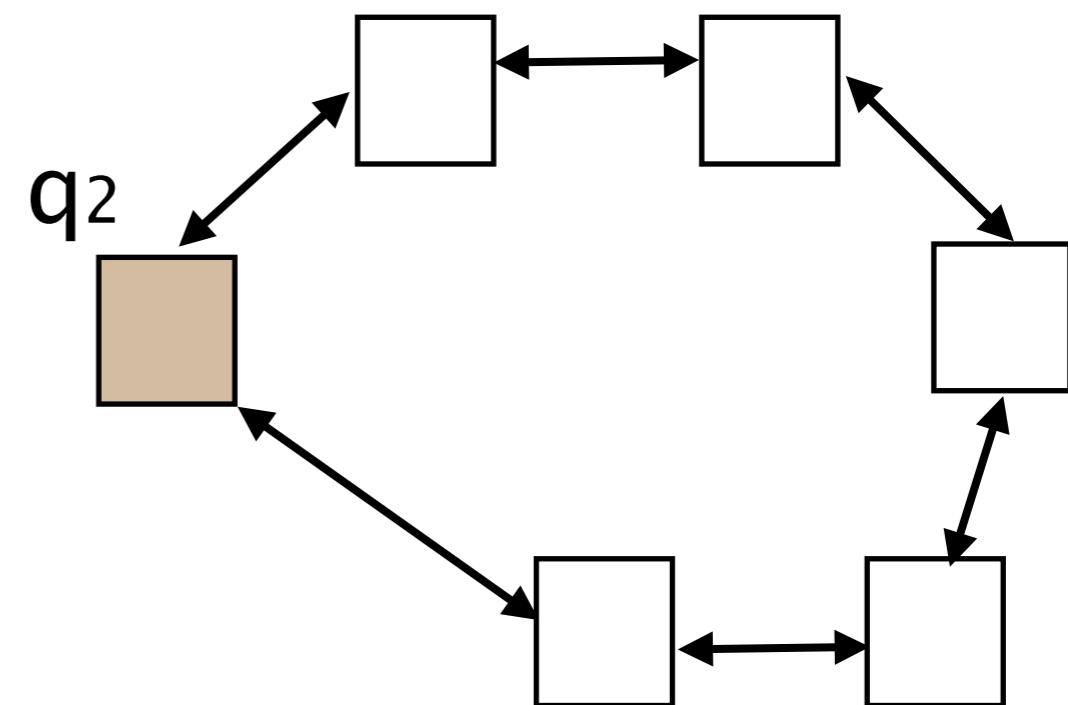


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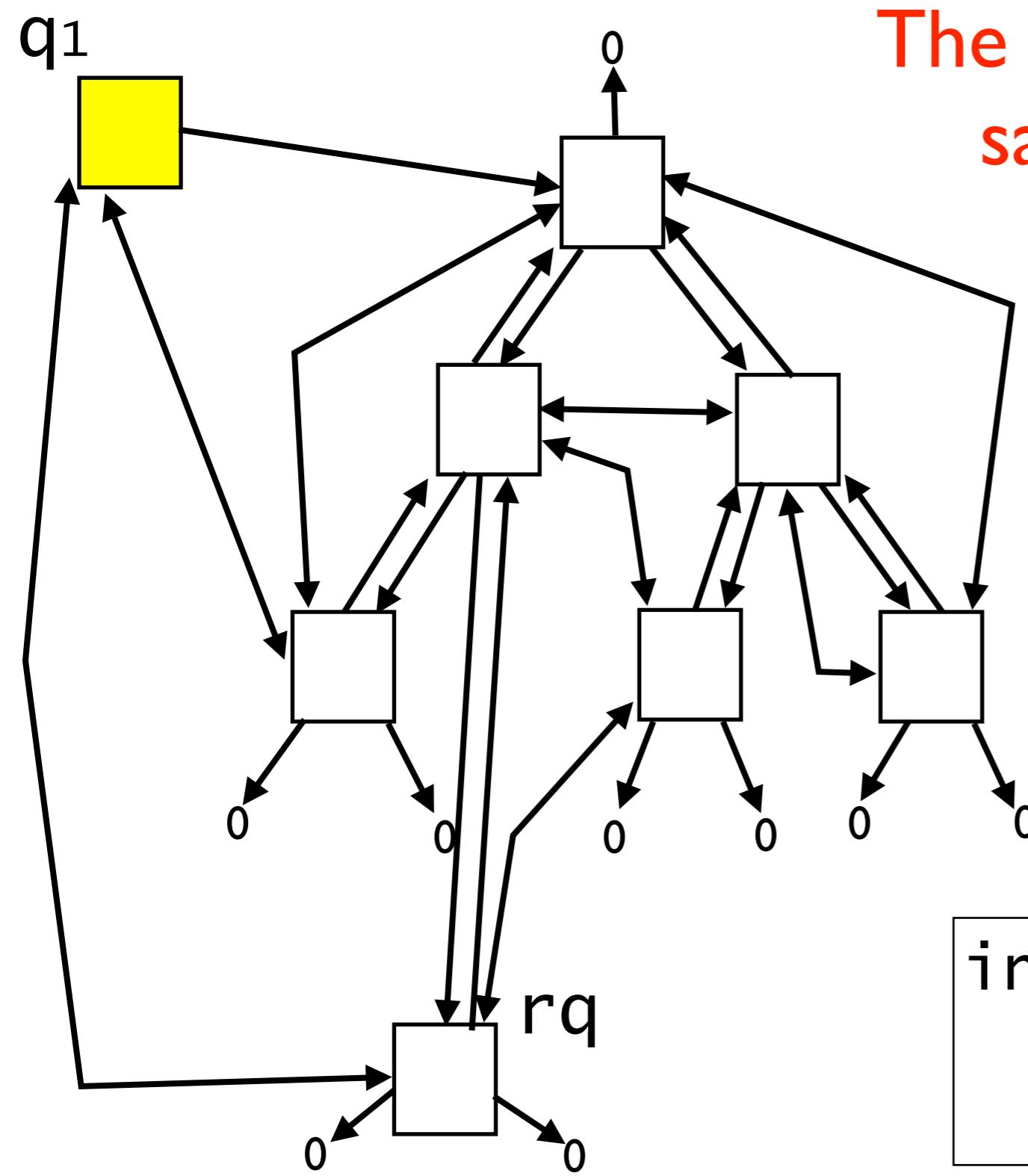


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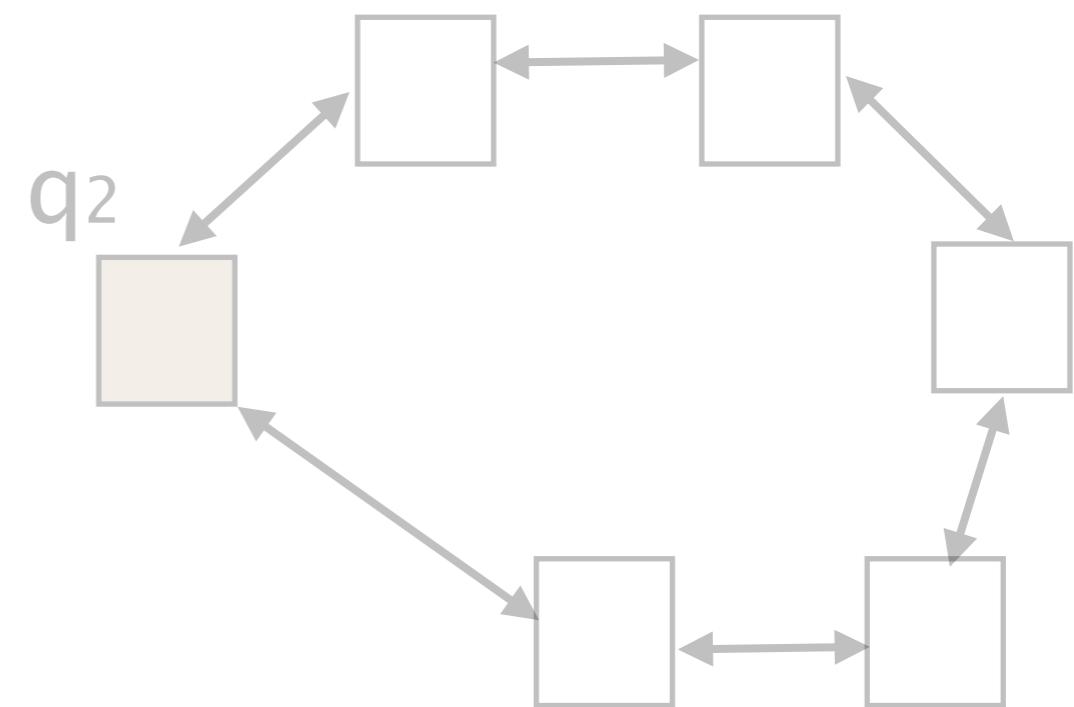


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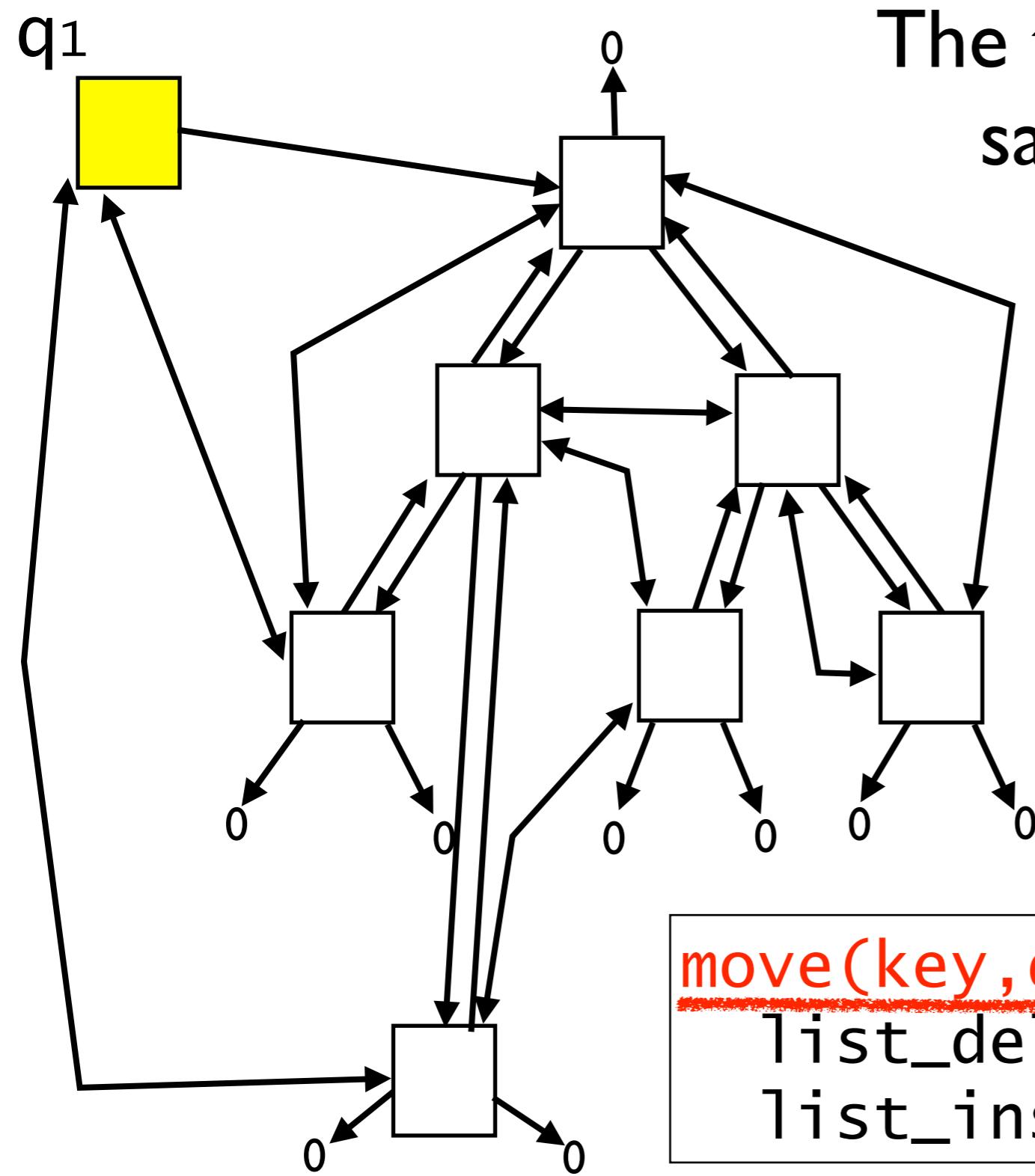


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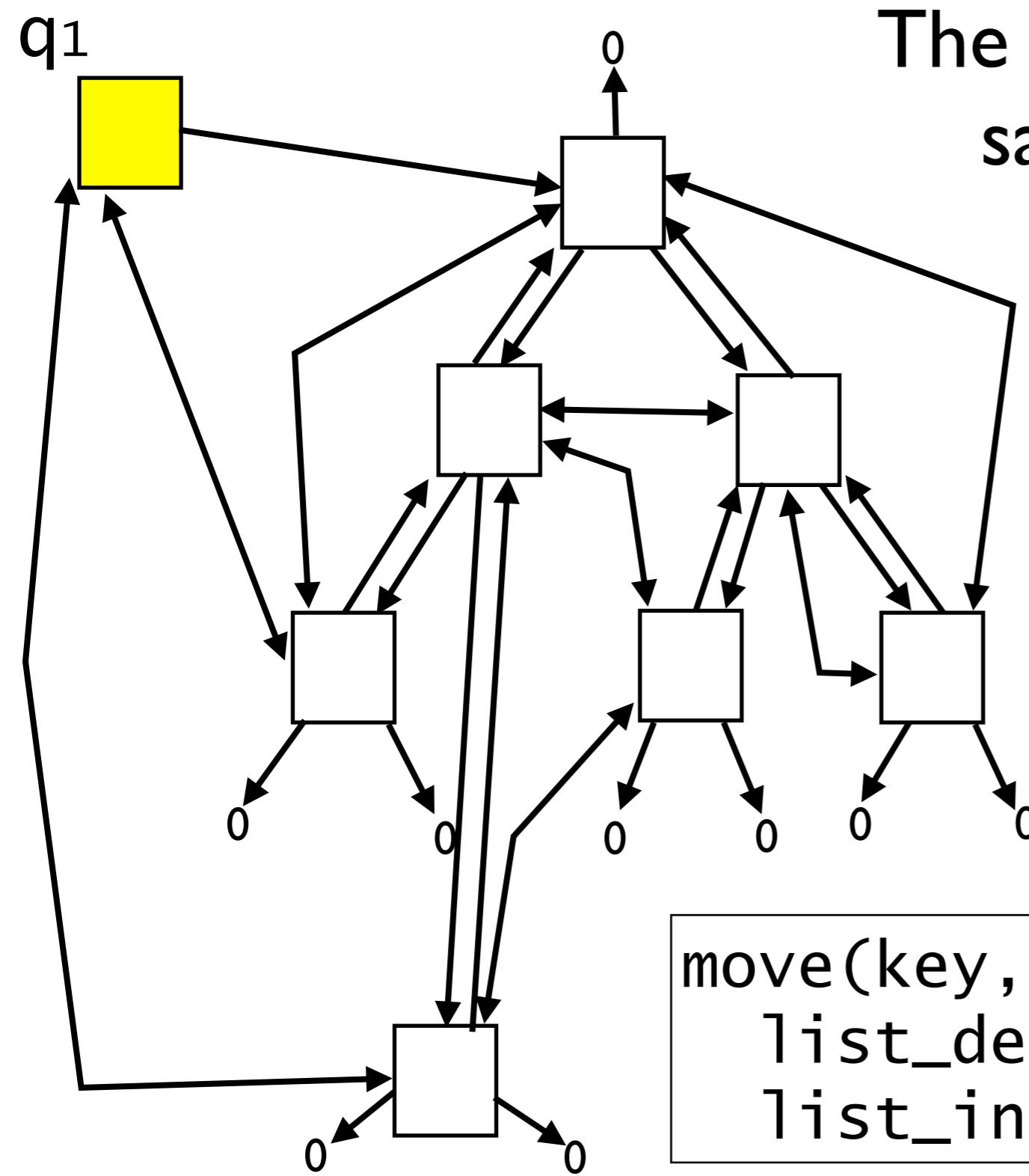
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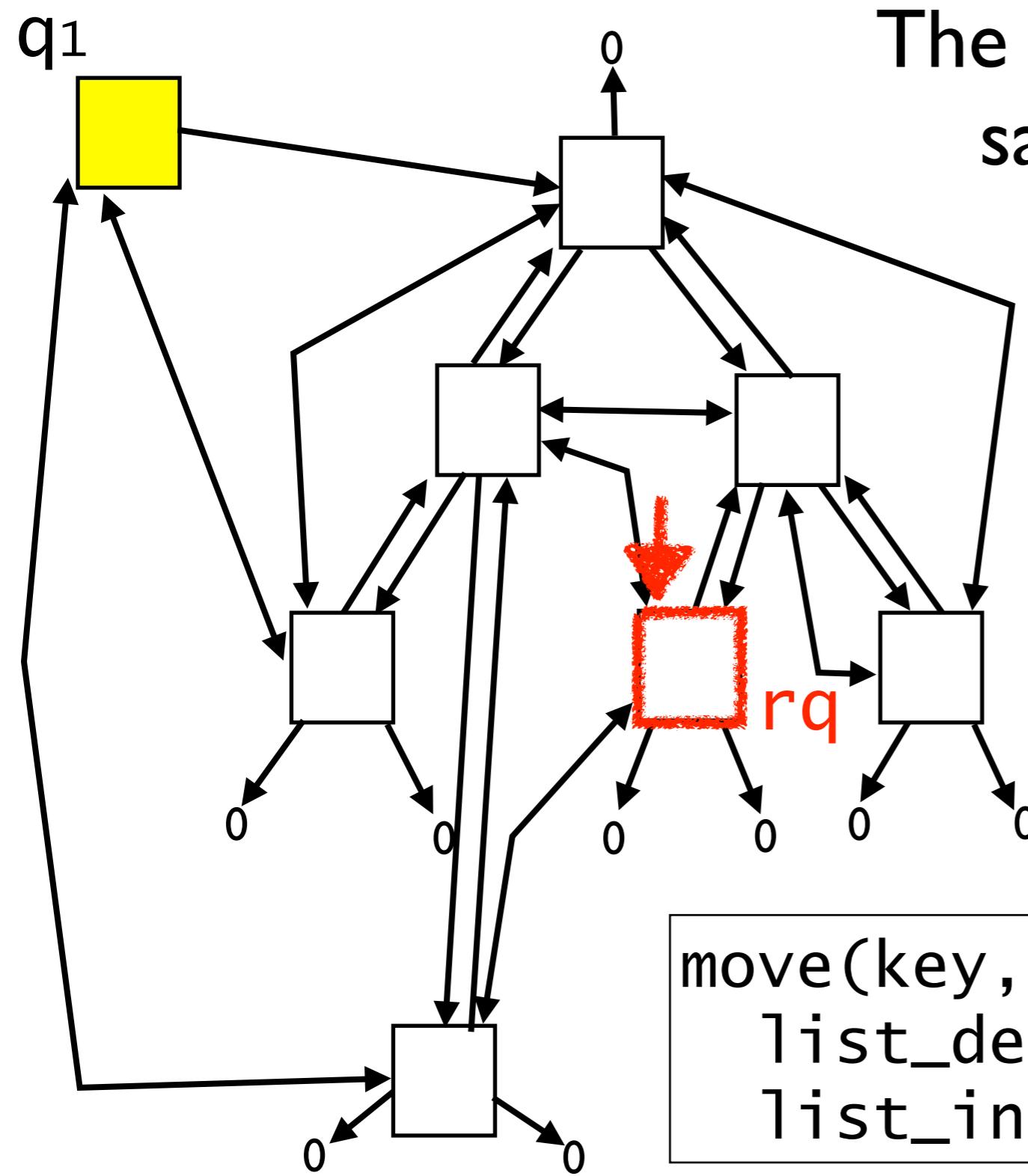
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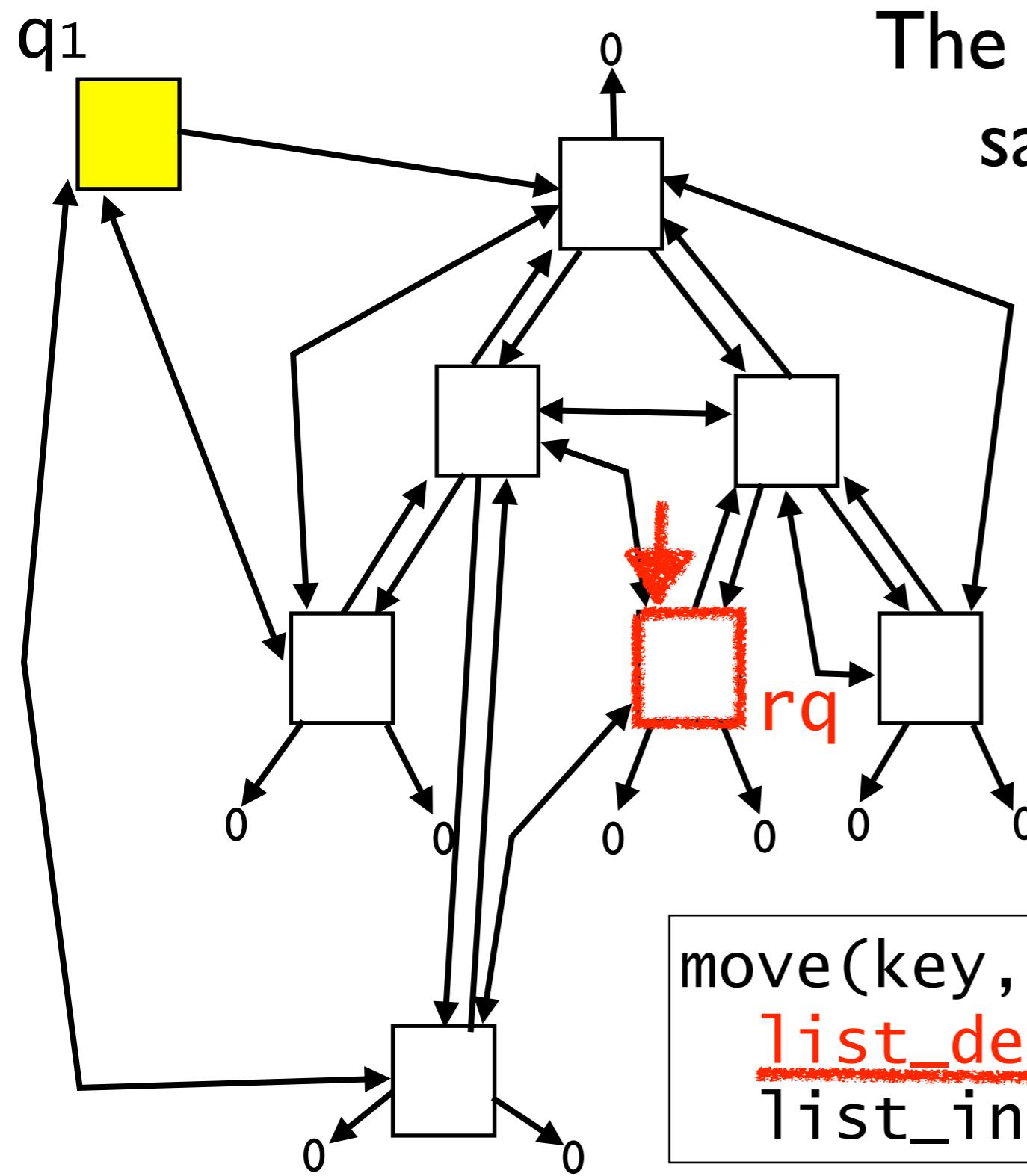
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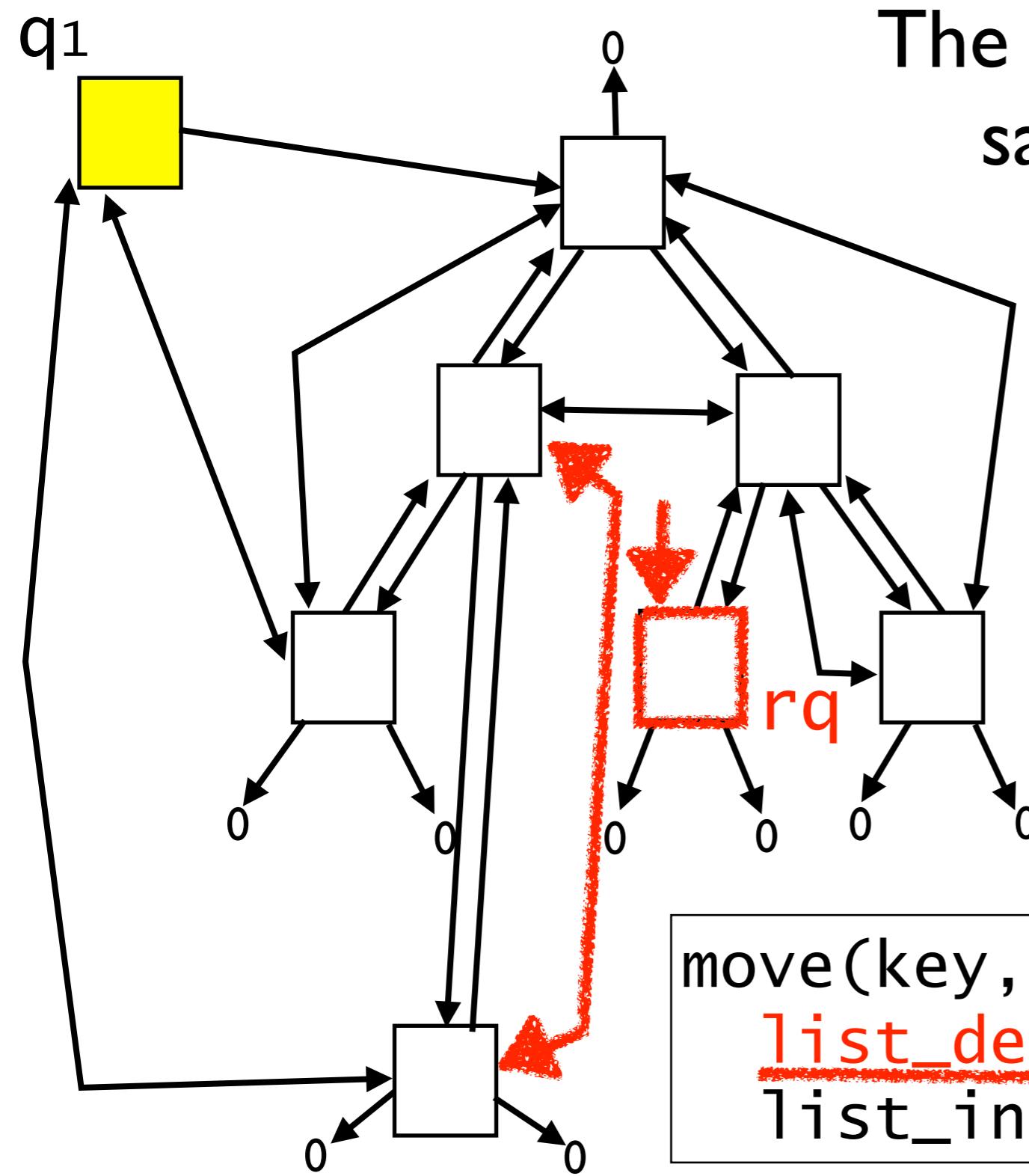
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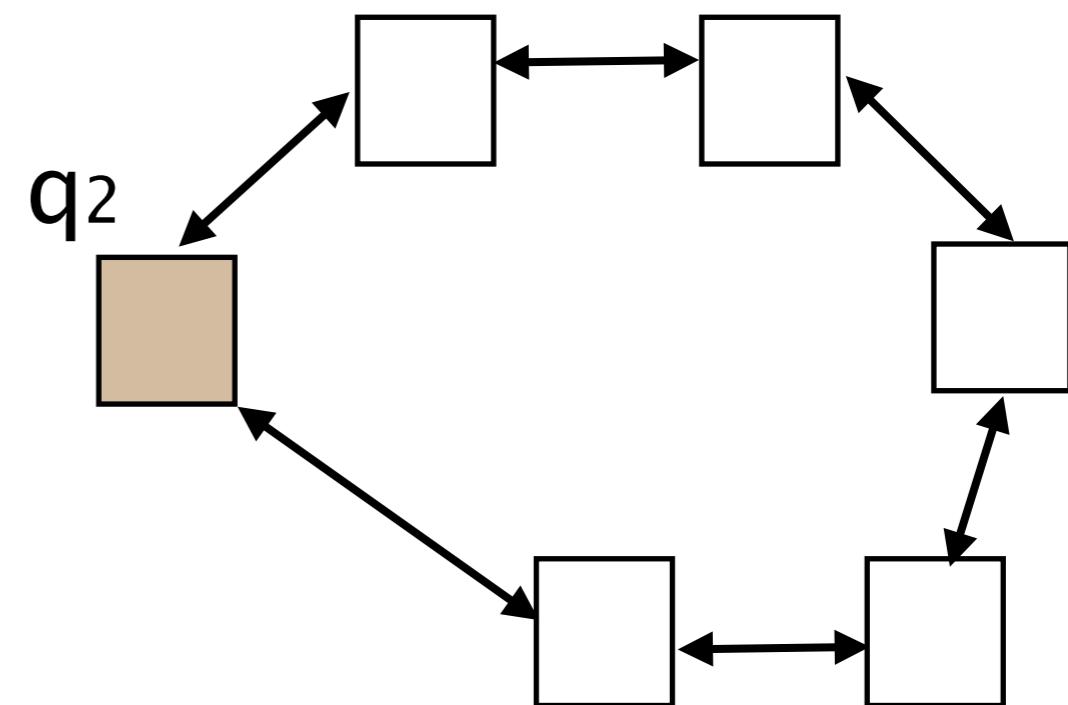
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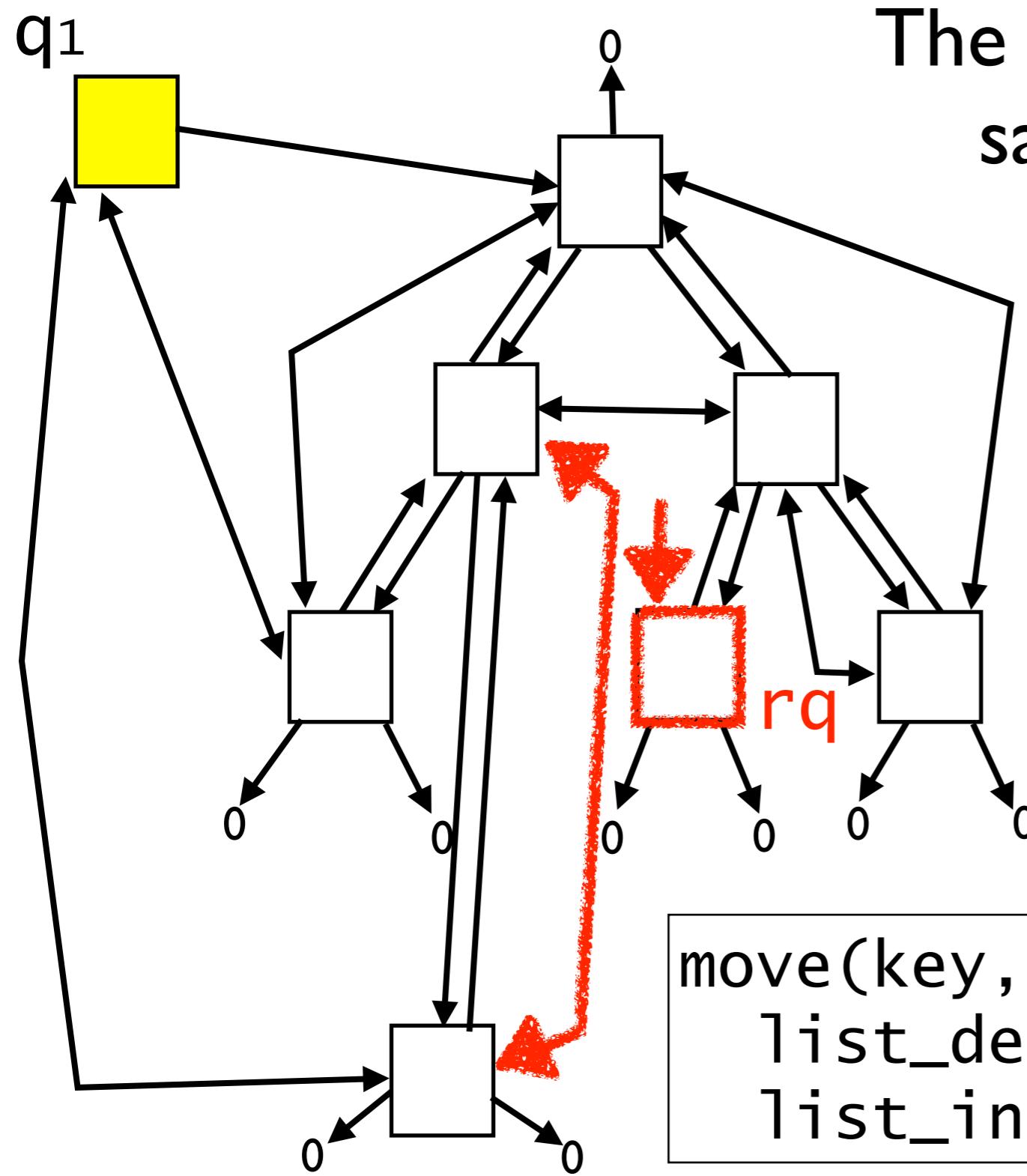


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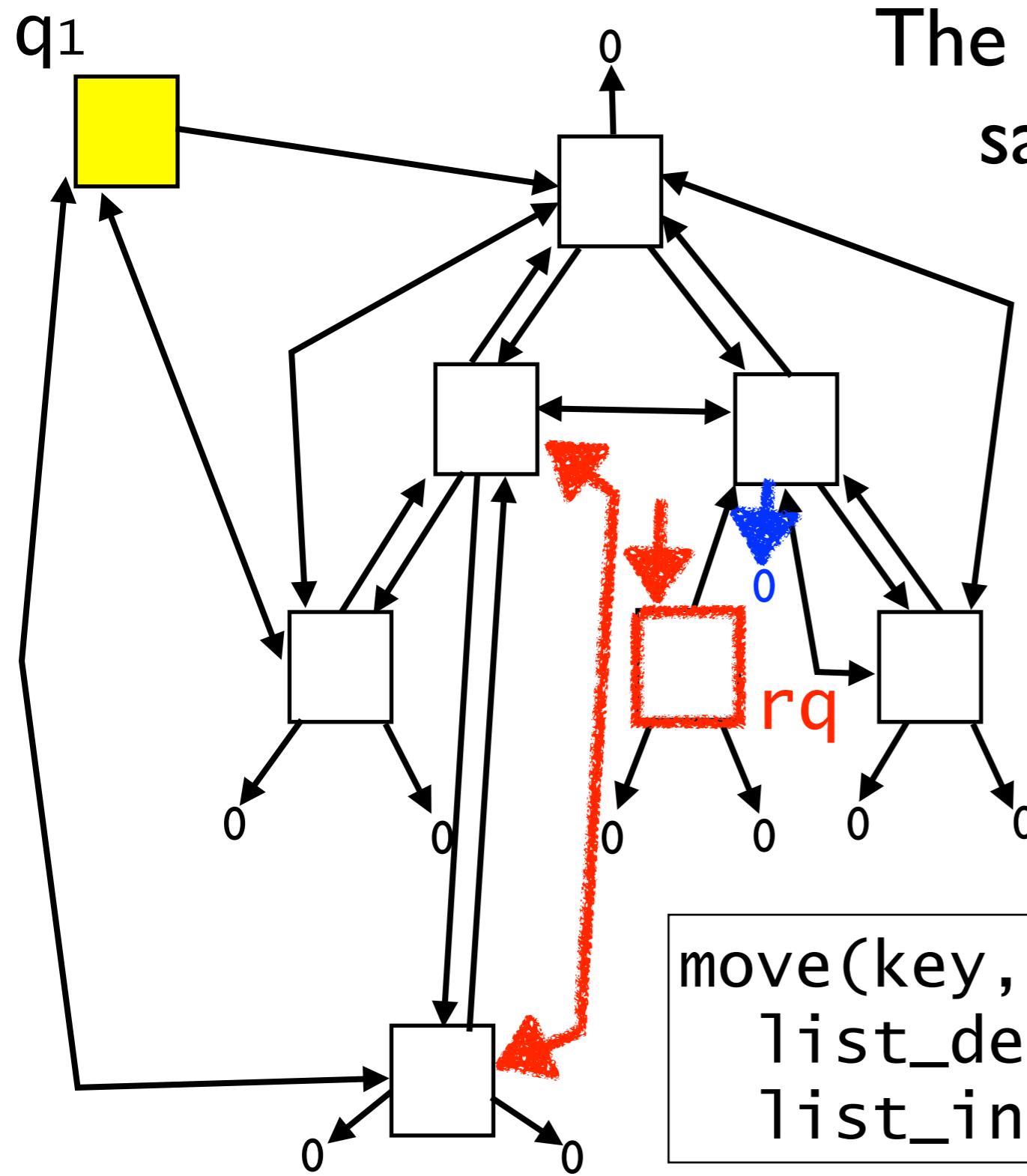
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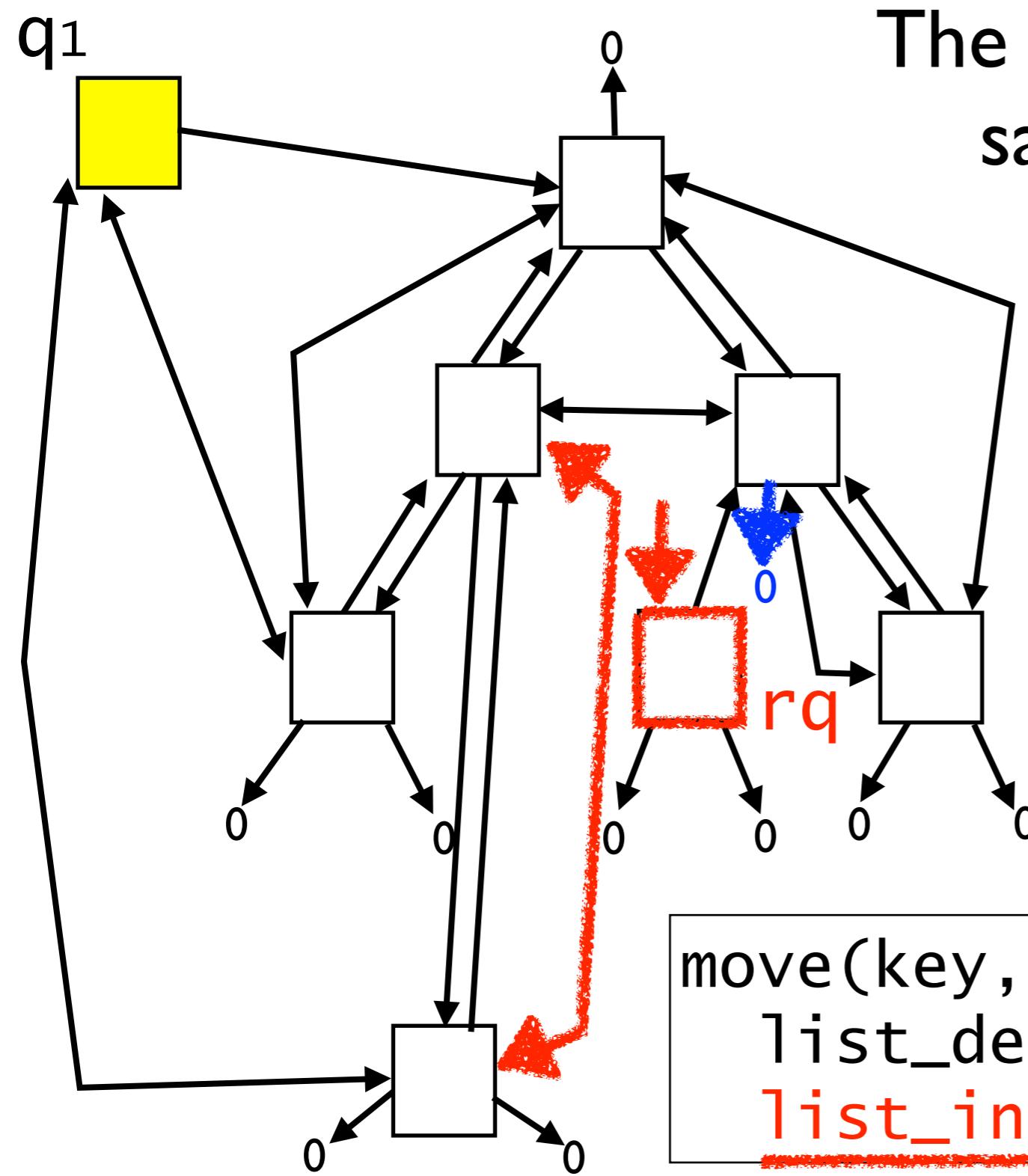
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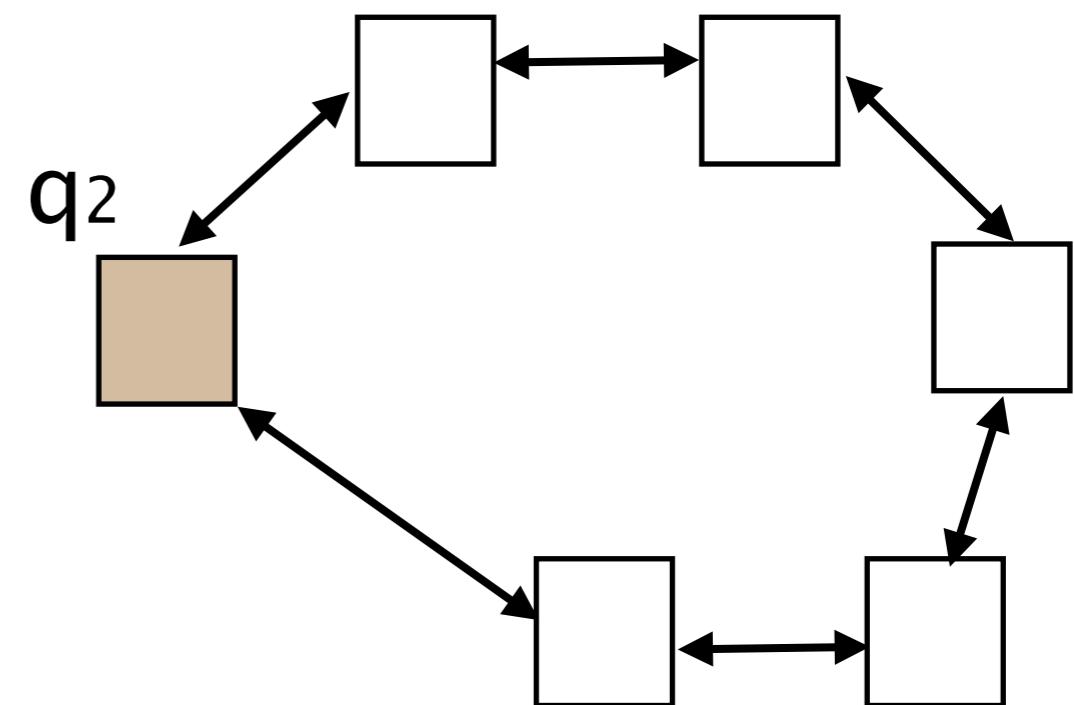
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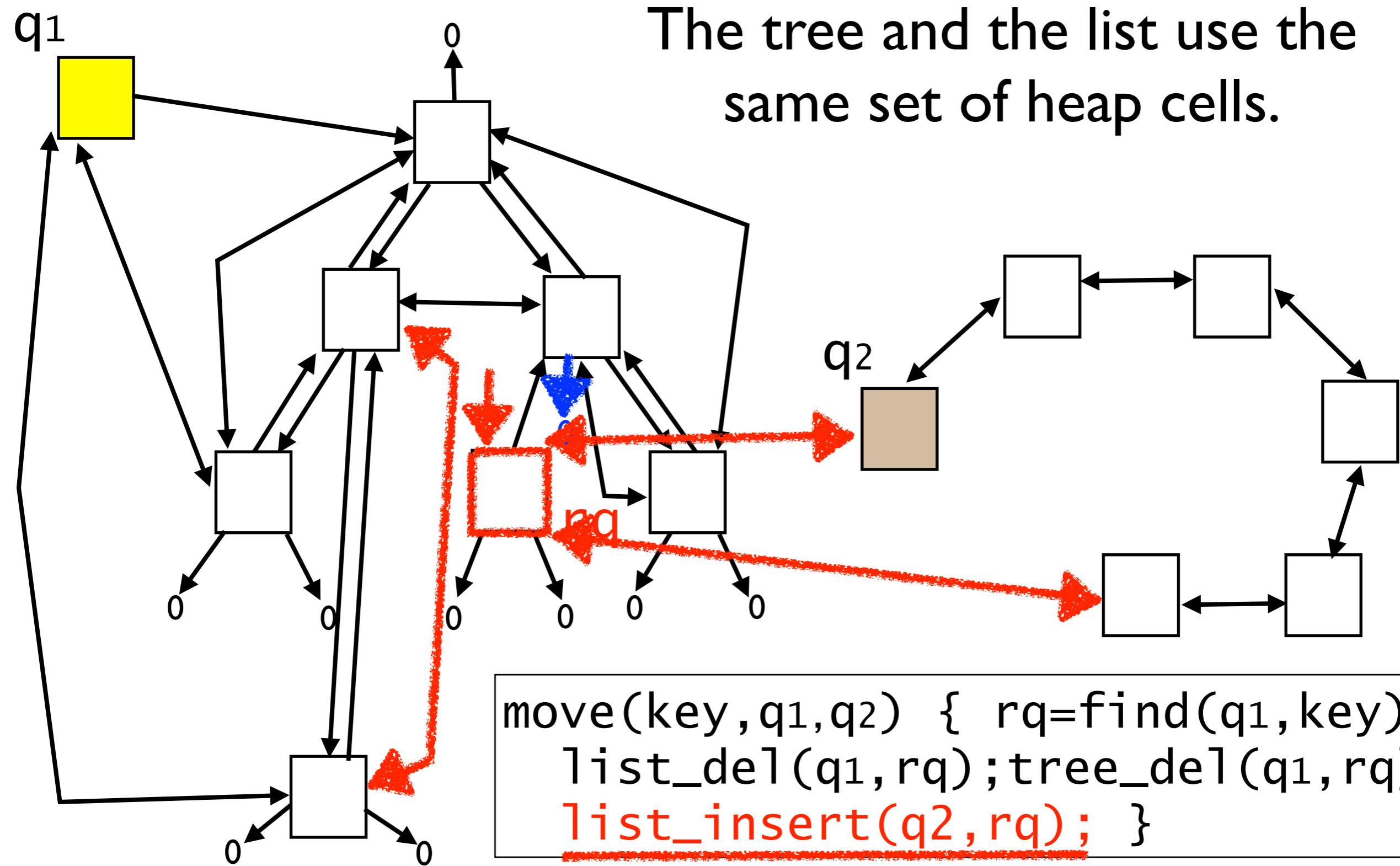


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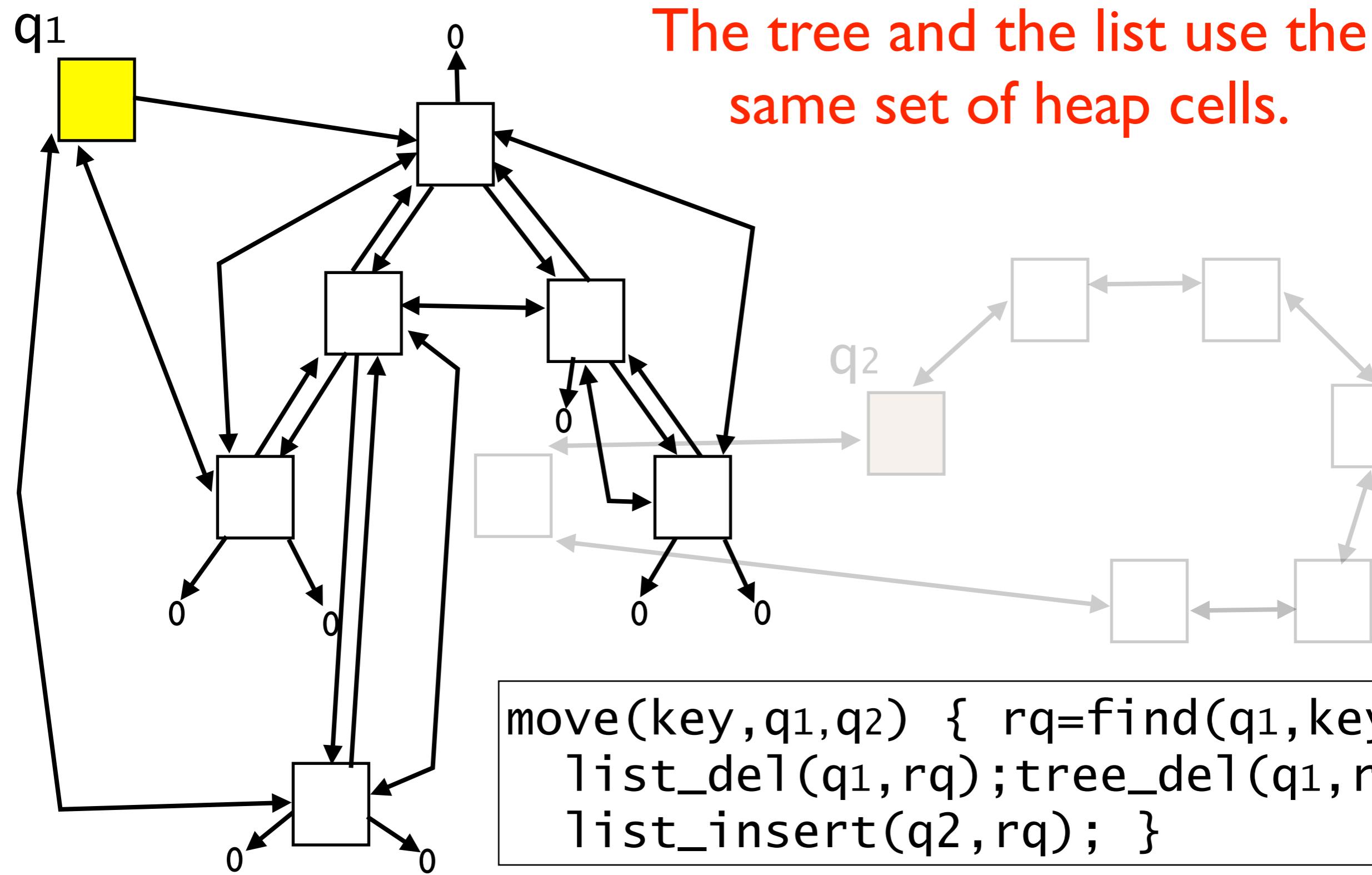


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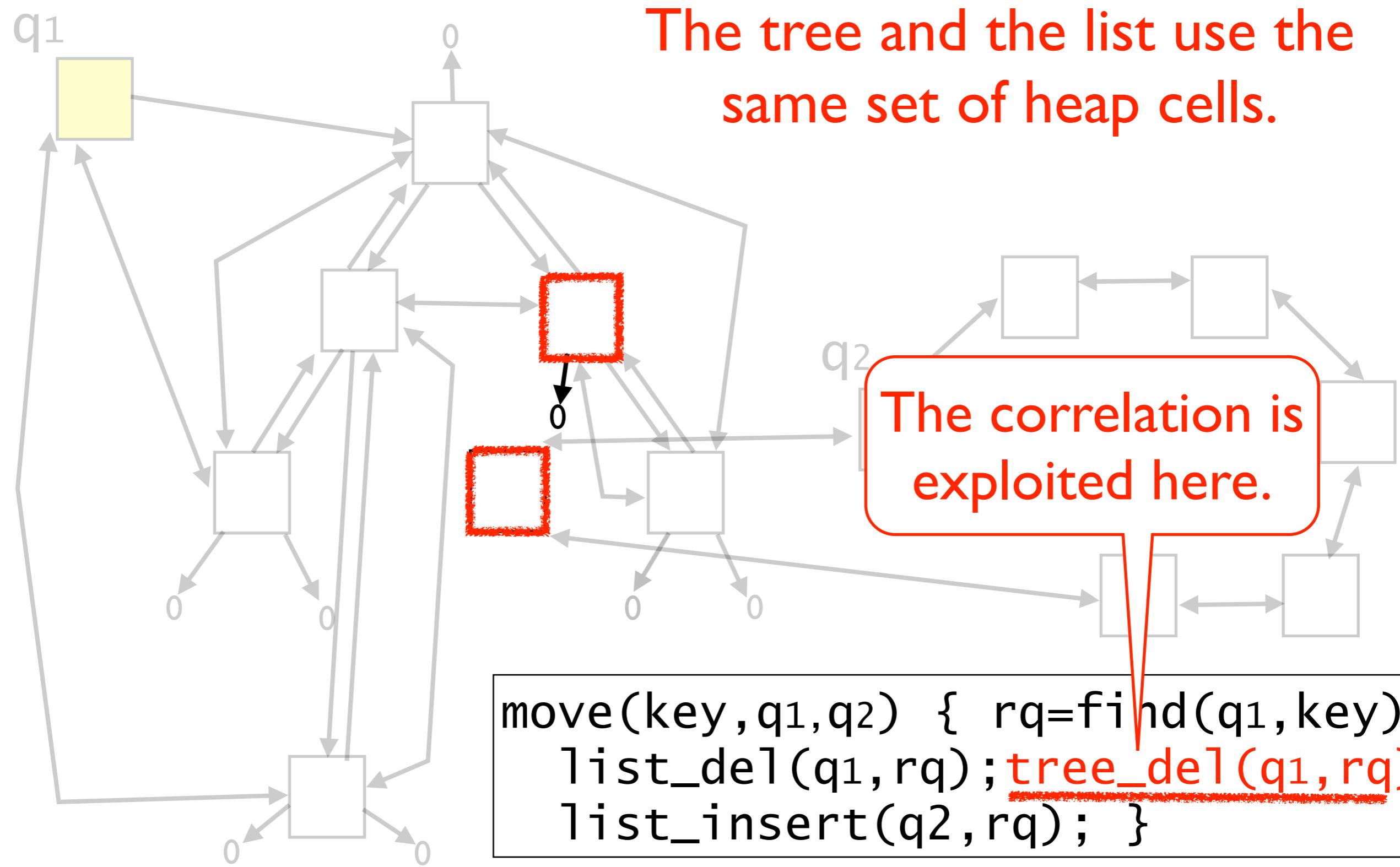
# Move a request



# Move a request



# Move a request



# Concrete goal

- Exploit the loose correlation, and build an efficient heap analysis for overlaid data structures.
- Verify the memory safety of the deadline IO scheduler.
  1. Aug'09 version: Too slow. Also too imprecise.
  2. Oct'09 version: Cannot prove one move routine.
  3. Nov'10 version: Can prove the whole in < 500s.

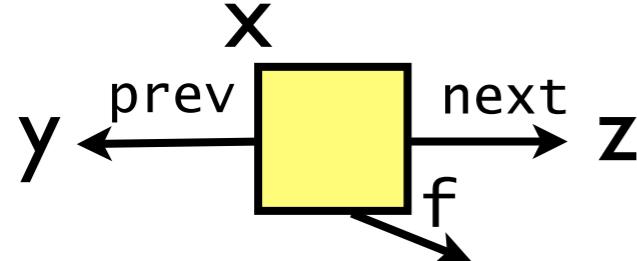
# Demo

# Design principle

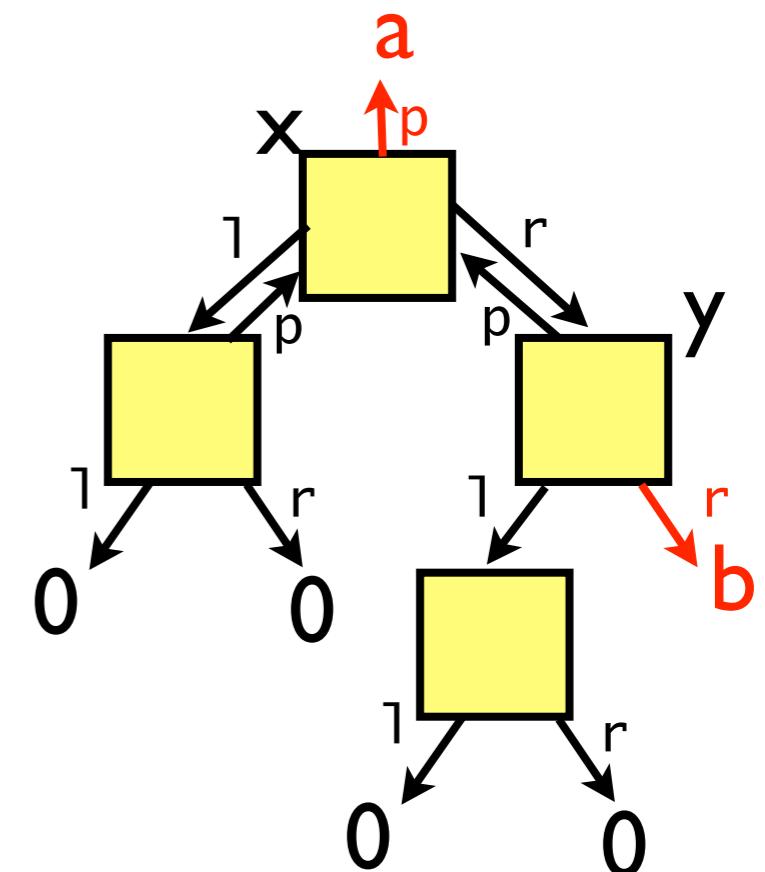
- Analyse the tree part and the list part of code as separately as possible.
- Separation buys us performance.
- Cannot be made completely separate.
- To allow communication between parts, we use ghost variables and infer ghost instructions during analysis.

# Assertions in separation logic

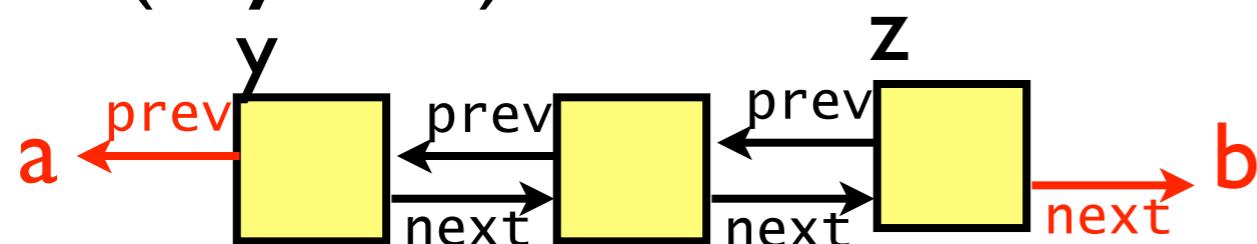
$x \mapsto \{ \text{prev: } y, \text{ next: } z \}$



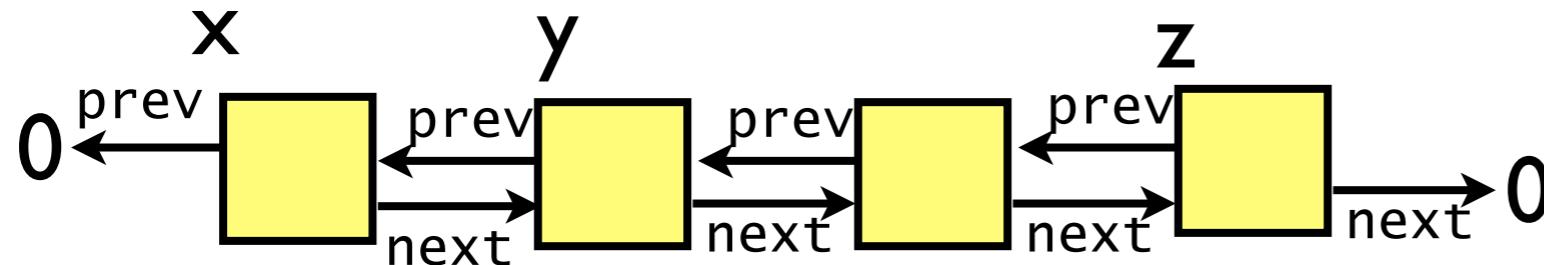
$\text{tree}_{\text{pe}}(a, x, y, b)$



$\text{ls}_{\text{ne}}(a, y, z, b)$



$x \mapsto \{ \text{prev: } 0, \text{ next: } y \} * \text{ls}_{\text{ne}}(x, y, z, 0)$



Also, includes standard logical connectives  $\wedge$ ,  $\vee$ ,  $\exists$  etc.

# Representation with \*, $\wedge$ and $\alpha$

$$(q_1 \mapsto \{ \text{root}:a' \}^\alpha * \text{tree}_{\text{pe}}(0,a',b',0)^\beta * \text{true}_Y) \quad \wedge \\ (q_1 \mapsto \{ \text{next}:c', \text{prev}:d' \}^\alpha * \text{ls}_{\text{pe}}(q_1,c',d',q_1)^\beta * \text{ls}_{\text{ne}}(e',q_2,e',q_2)_Y)$$

# Representation with \*, $\wedge$ and $\alpha$

Conjunct for tree-related properties

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Conjunct for list-related properties

# Representation with \*, $\wedge$ and $\alpha$

$$(q_1 \mapsto \{ \text{root}: a' \} \underline{\alpha} * \text{tree}_{\text{pe}}(0, a', b', 0) \underline{\beta} * \text{true} \underline{\gamma}) \quad \wedge \\ (q_1 \mapsto \{ \text{next}: c', \text{prev}: d' \} \underline{\alpha} * \text{ls}_{\text{pe}}(q_1, c', d', q_1) \underline{\beta} * \text{ls}_{\text{ne}}(e', q_2, e', q_2) \underline{\gamma})$$

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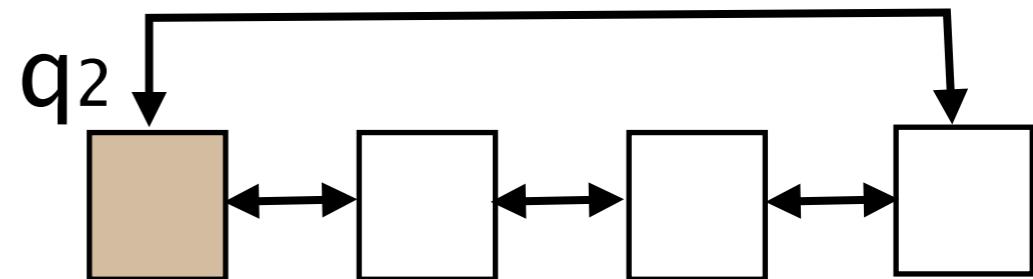
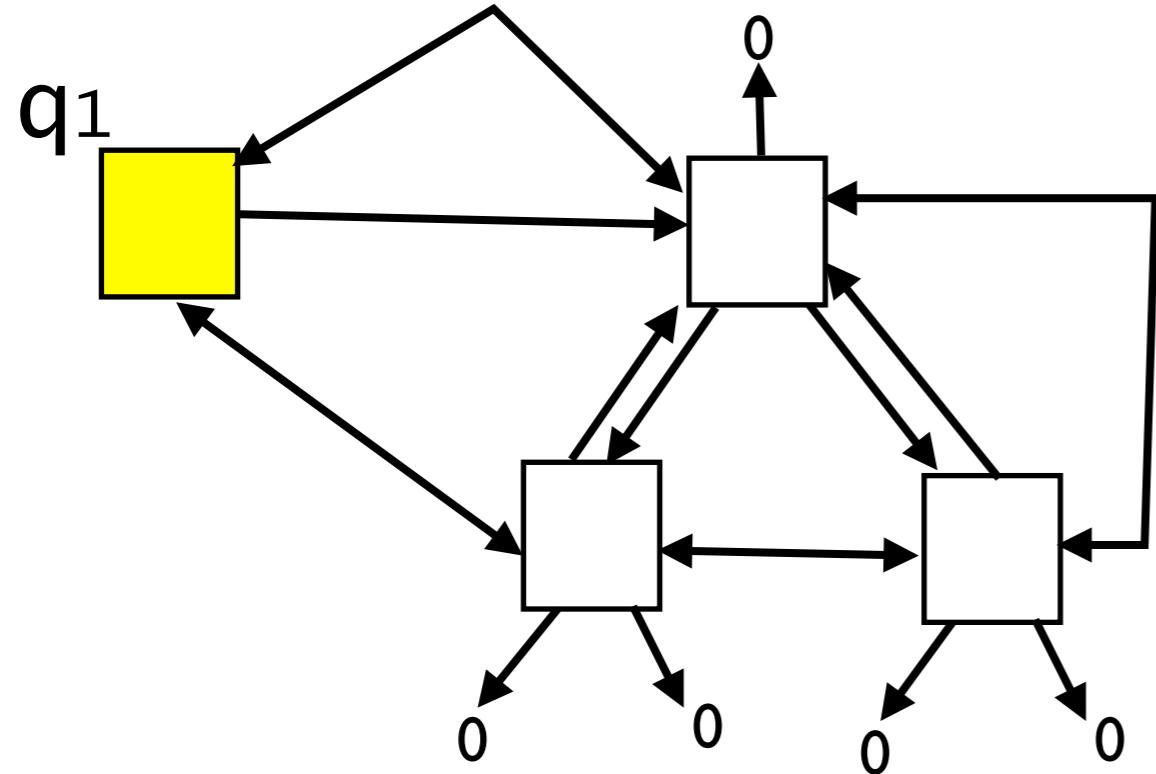
$\exists a', b'$

~~$(q_1 \mapsto \{ \text{root: } a' \}^\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)^\beta * \text{true}_Y) \wedge$~~

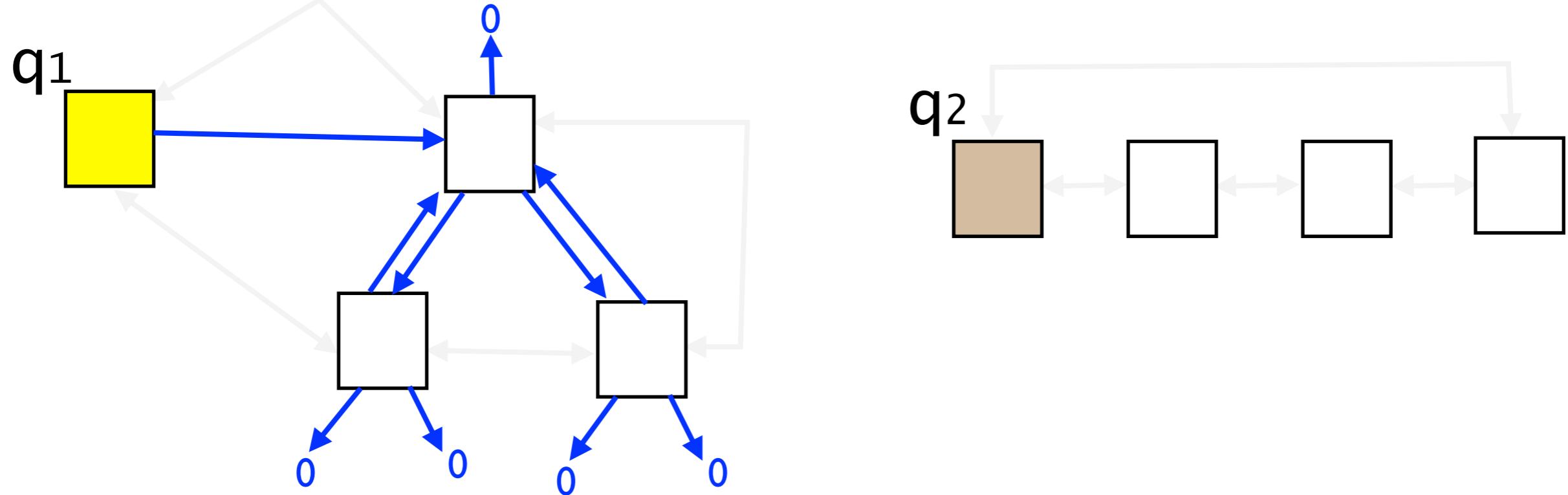
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$\exists c', d', e'$

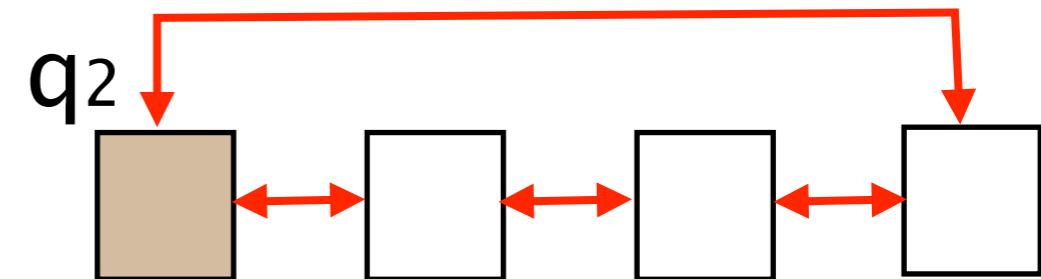
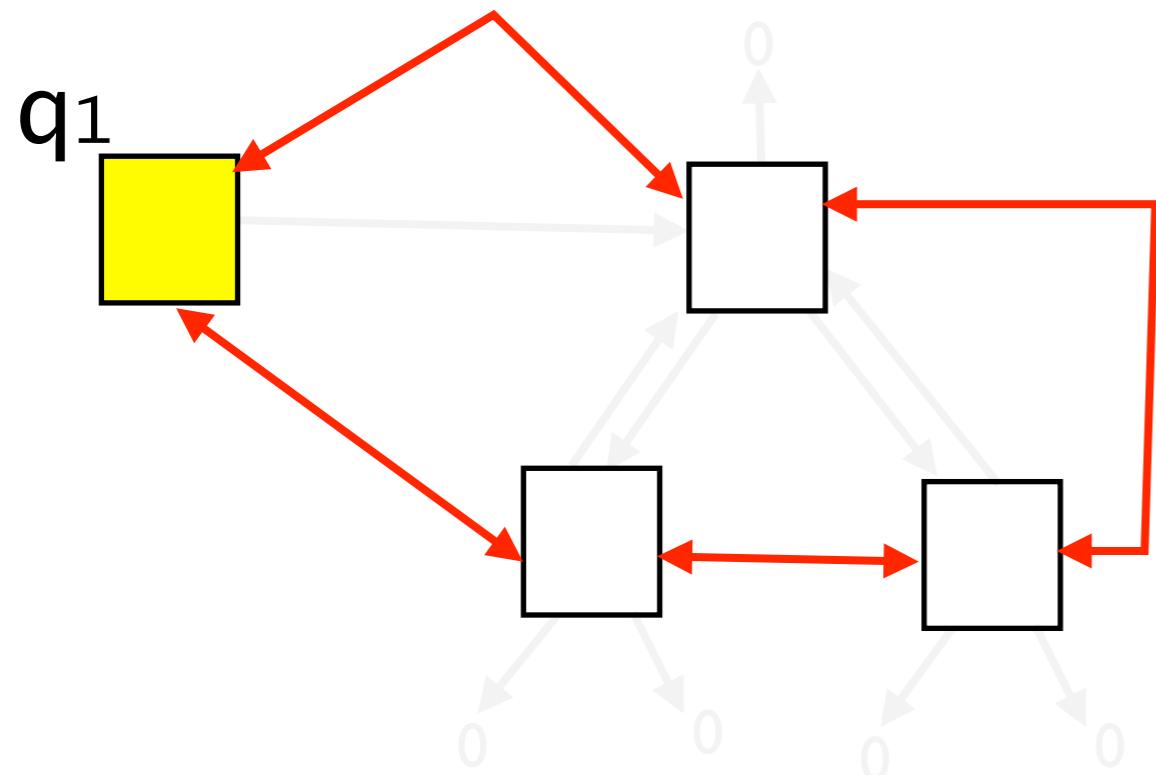
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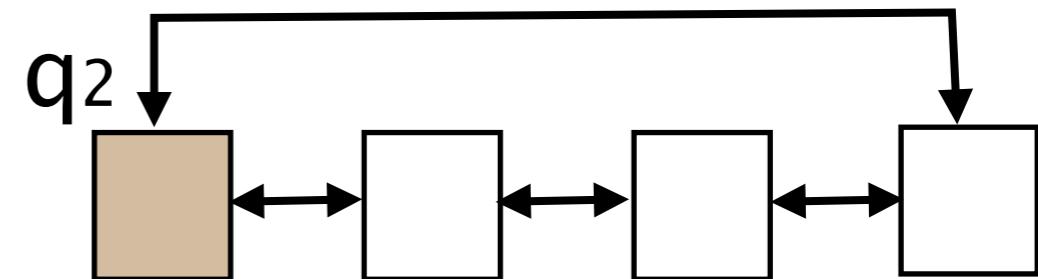
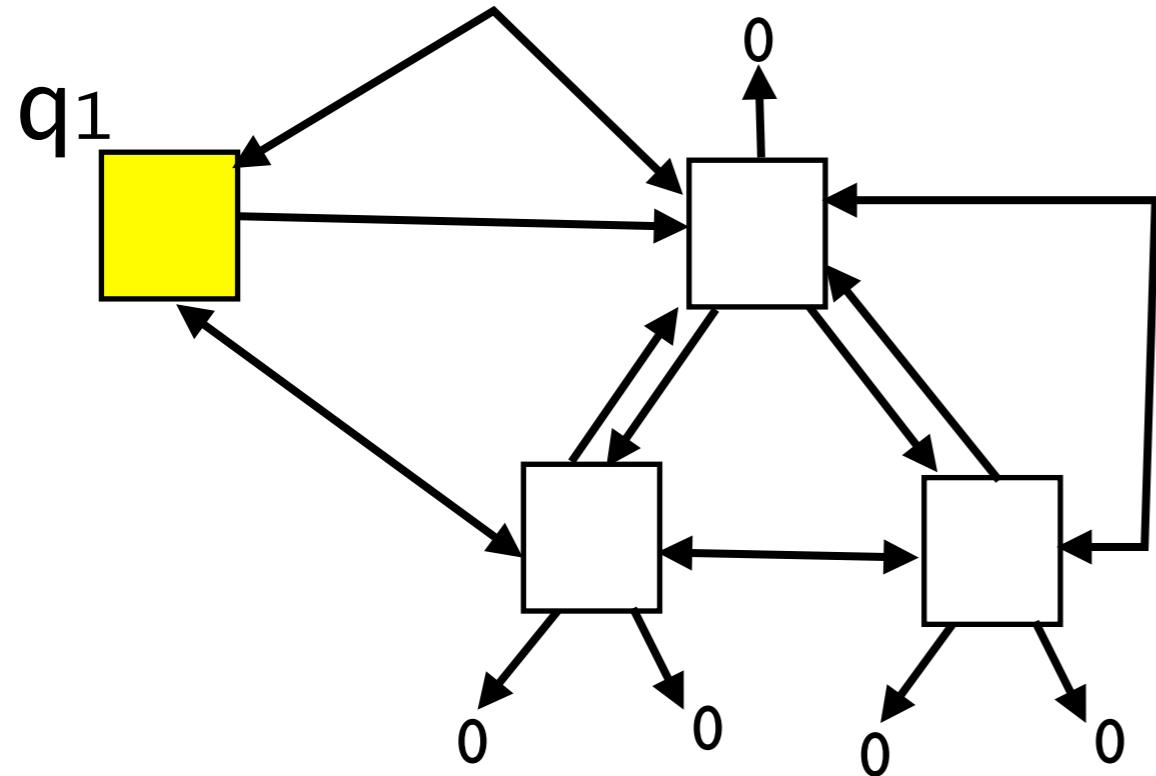
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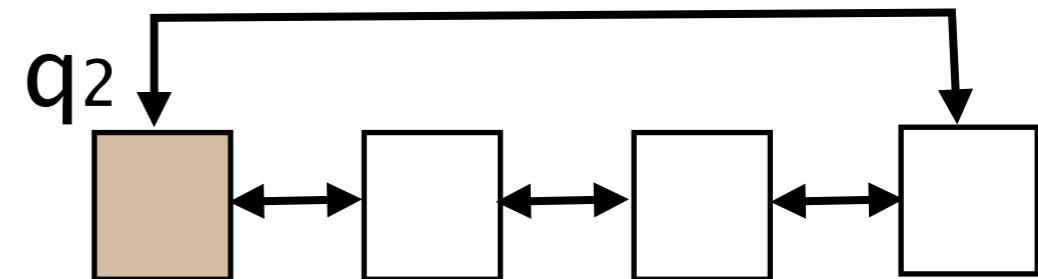
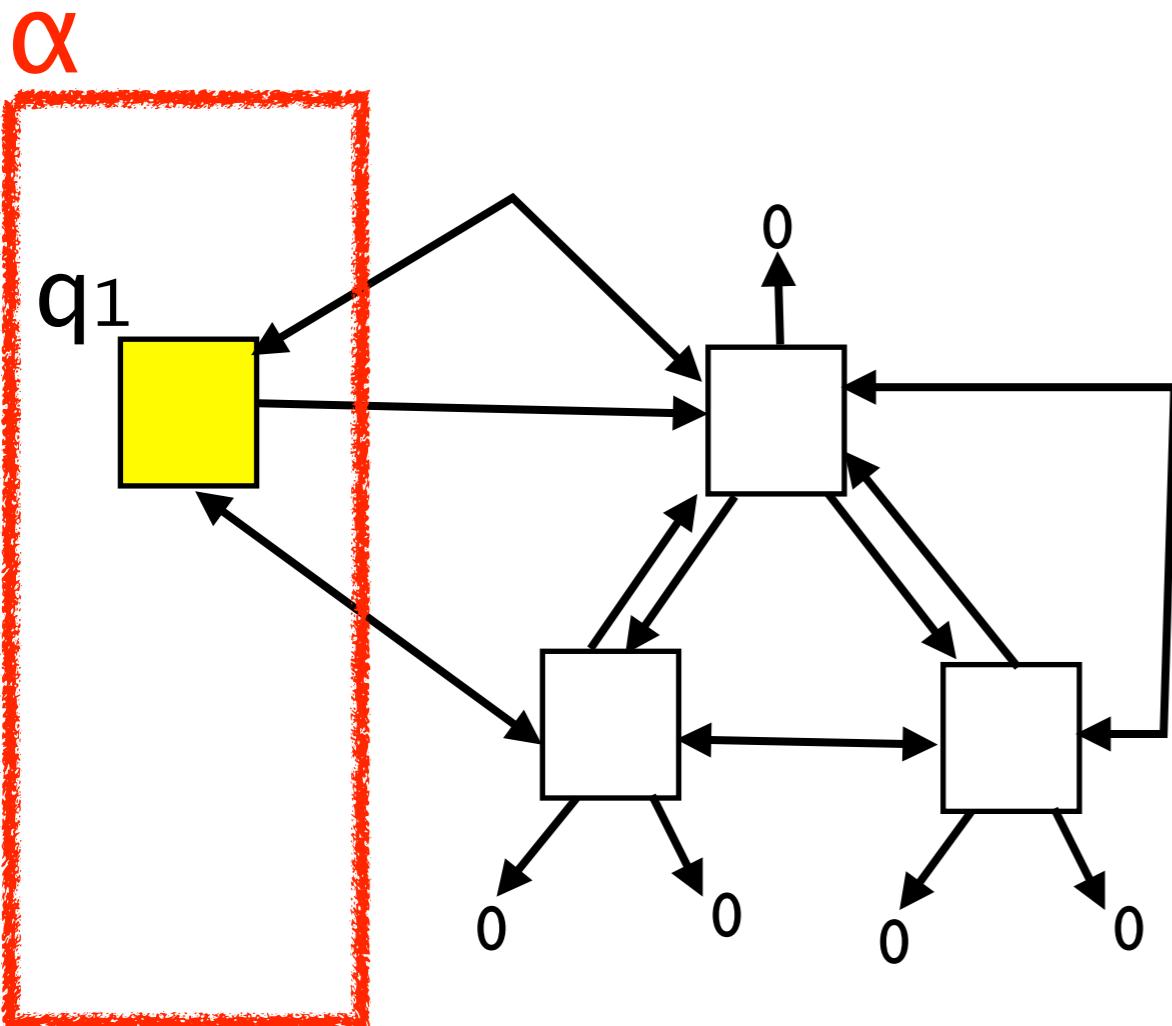
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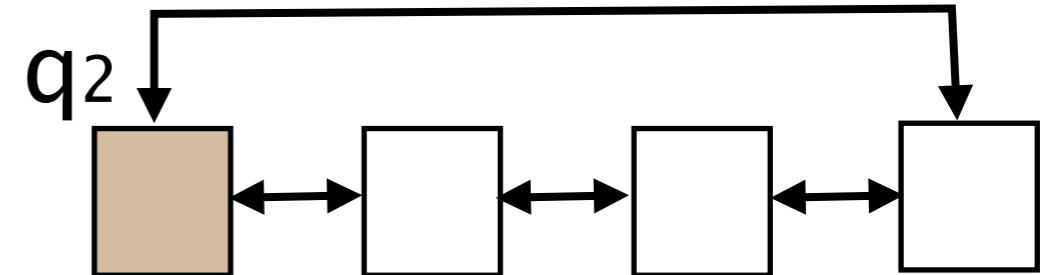
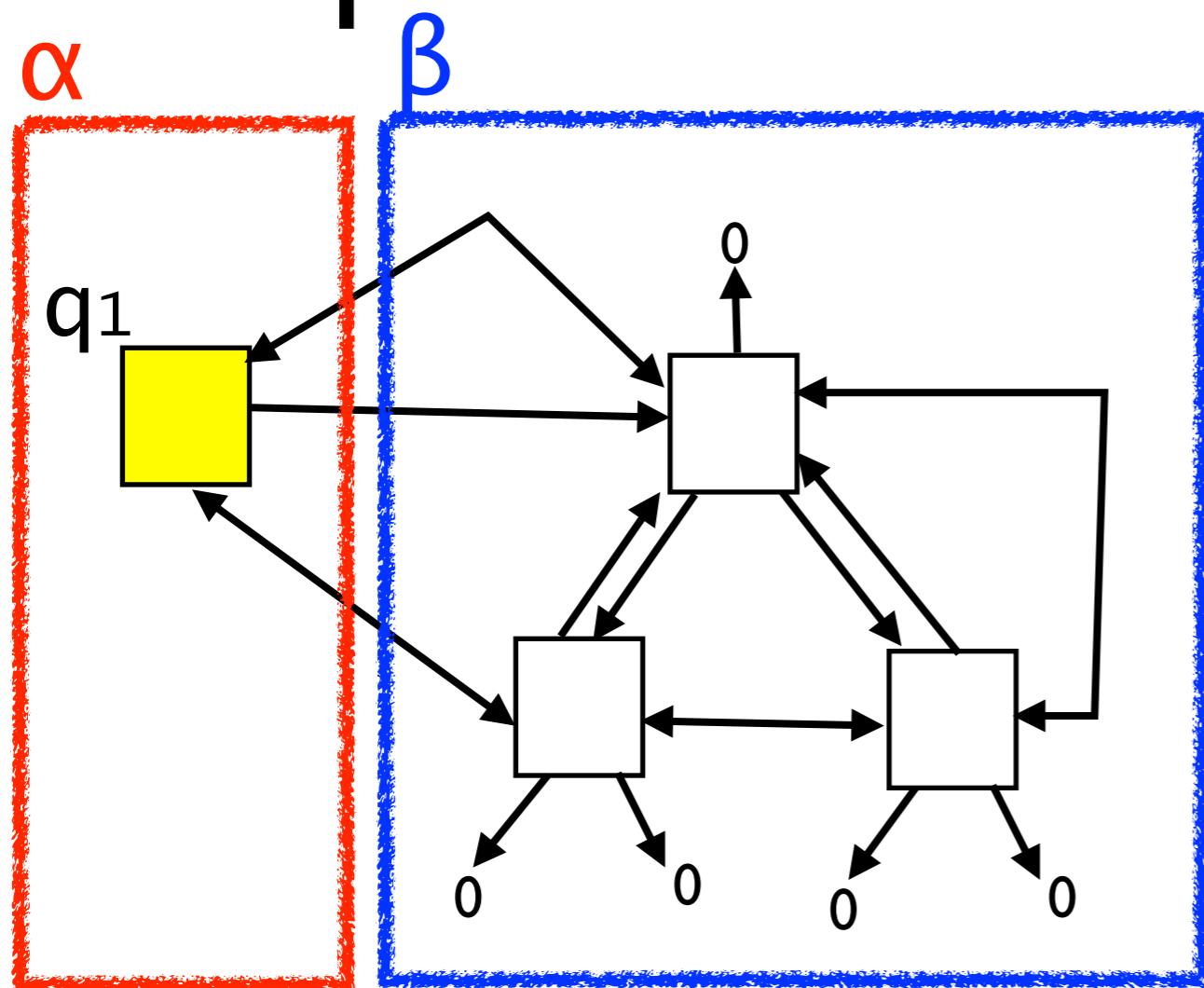
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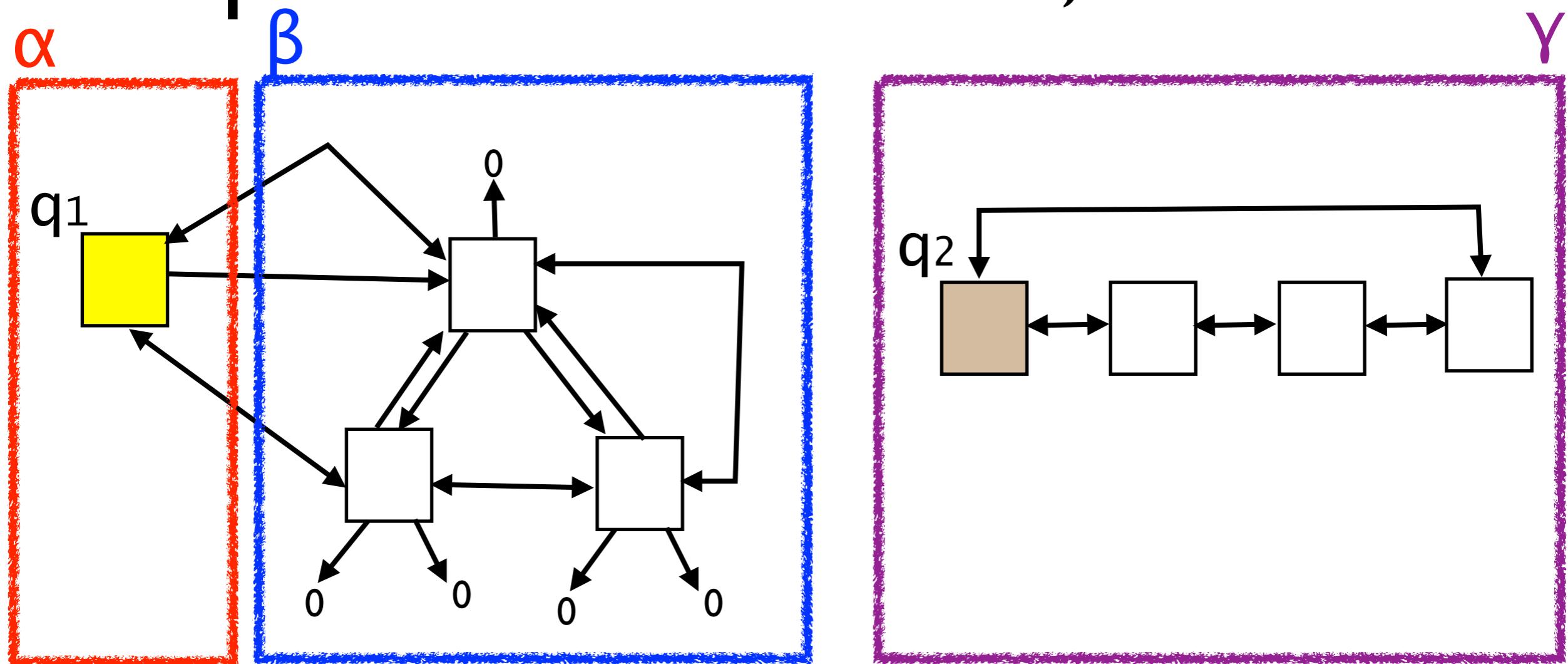
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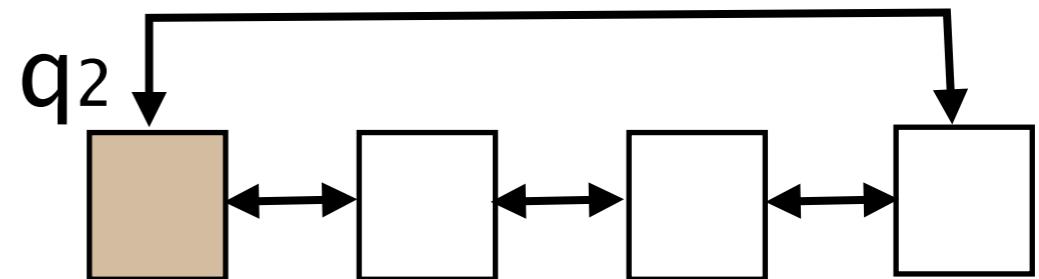
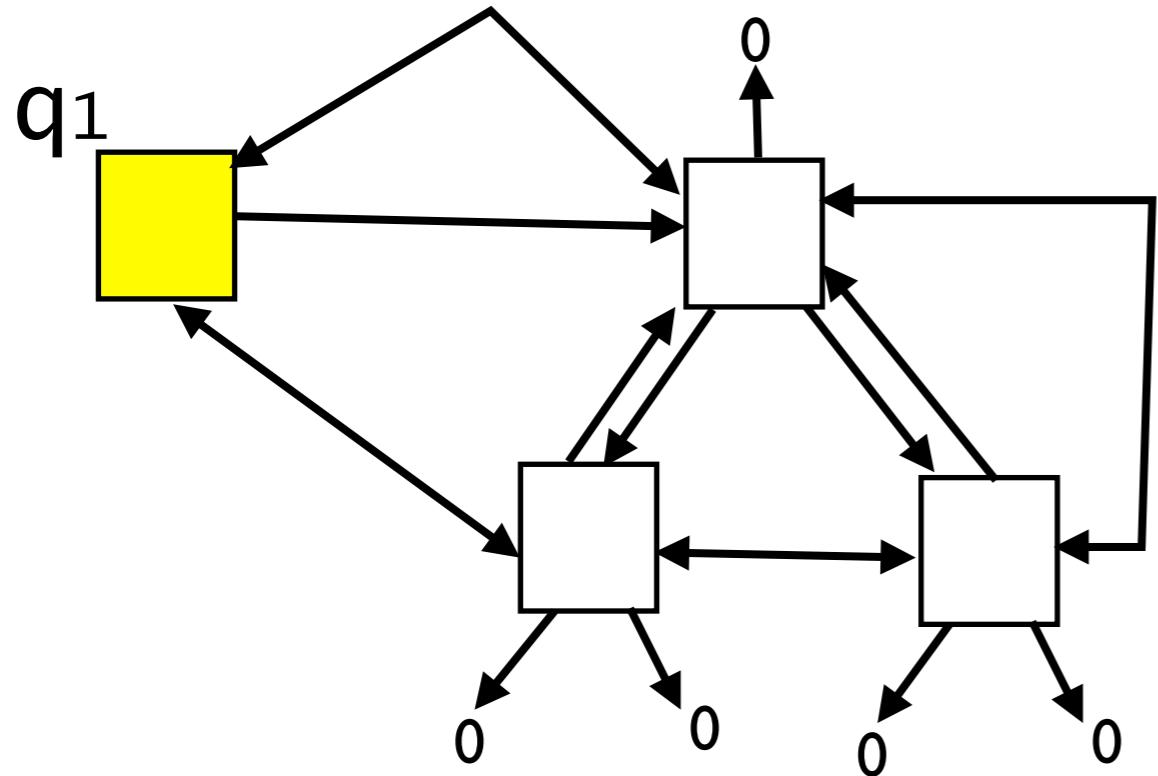
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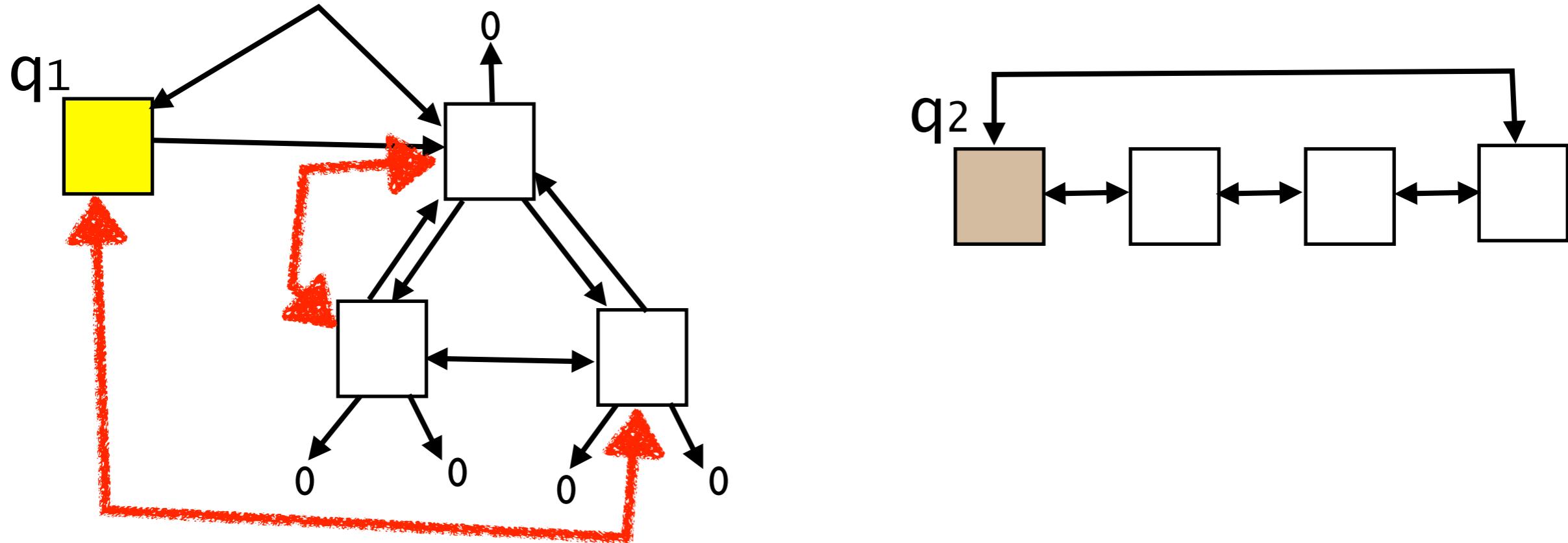


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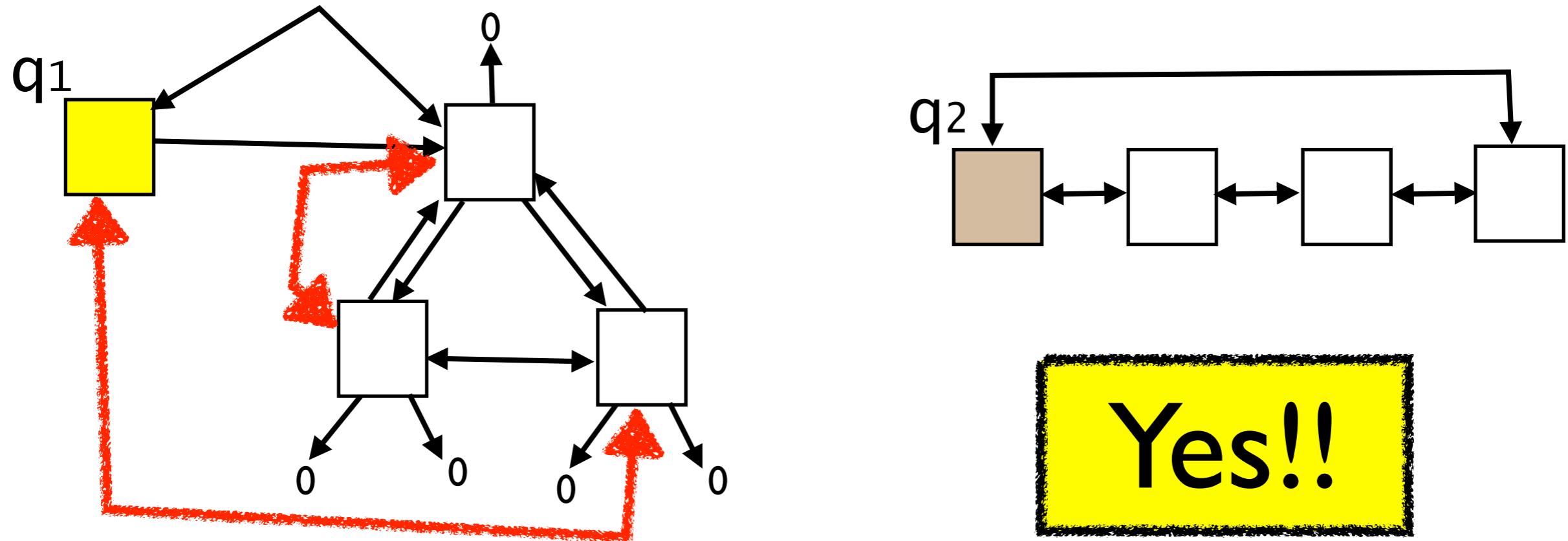
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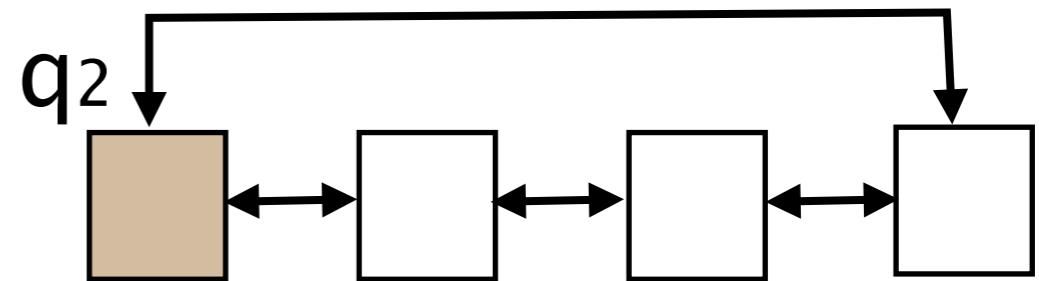
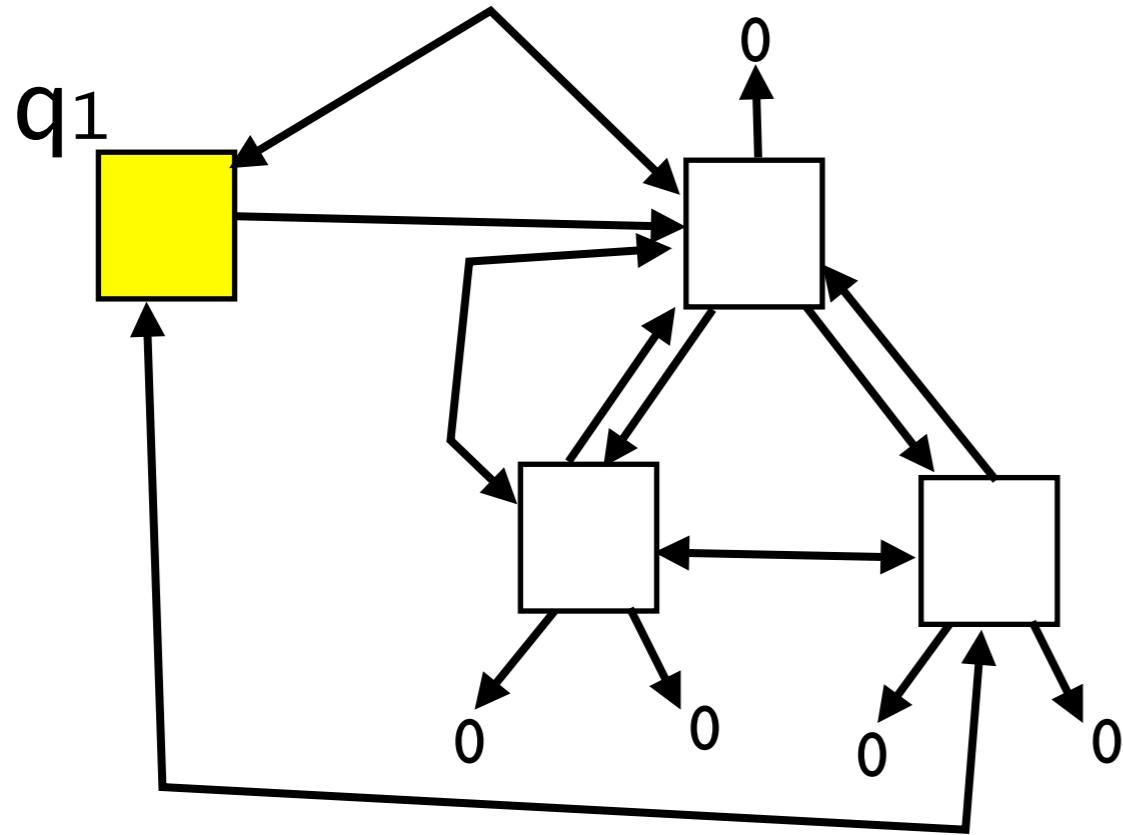
# Loose correlation


$$(q_1 \xrightarrow{\{\text{root:}a'\}_\alpha} * \text{tree}_{\text{pe}}(0,a',b',0)_\beta * \text{true}_Y) \quad \wedge \\ (q_1 \xrightarrow{\{\text{next:}c', \text{prev:}d'\}_\alpha} * \text{ls}_{\text{pe}}(q_1,c',d',q_1)_\beta * \text{ls}_{\text{ne}}(e',q_2,e',q_2)_Y)$$

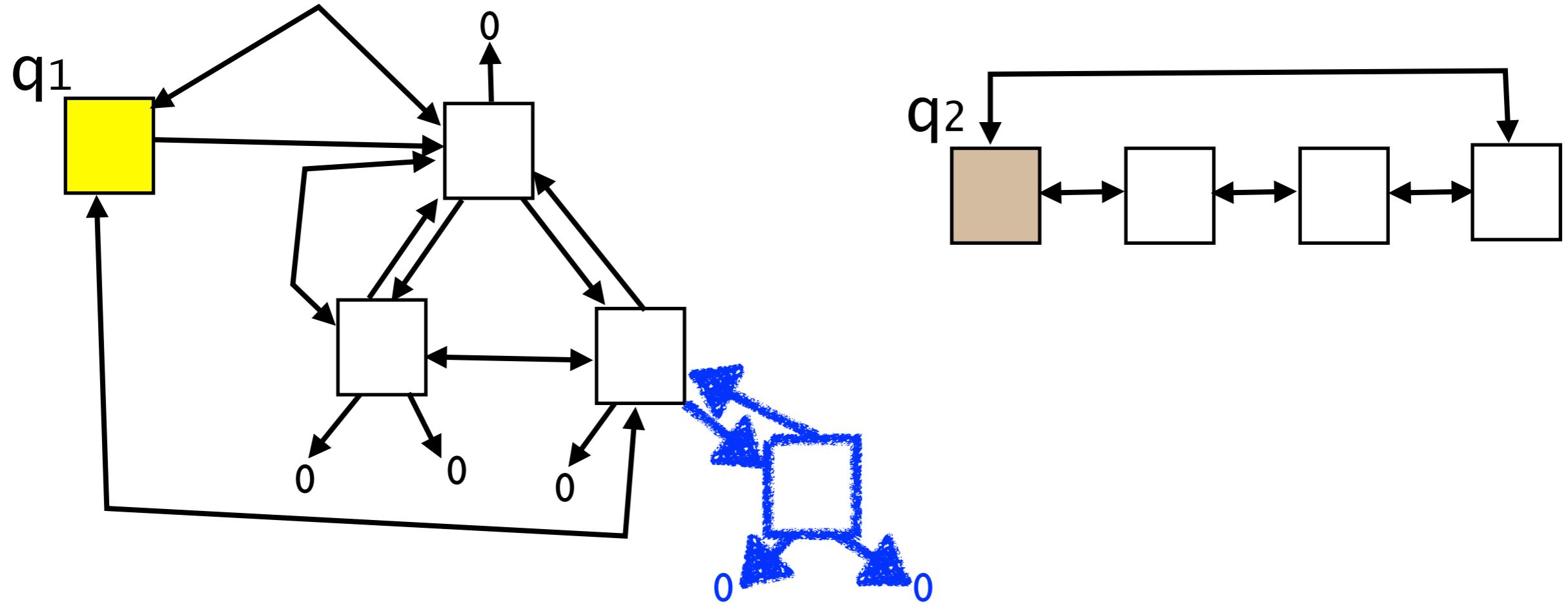
# Loose correlation


$$(q_1 \xrightarrow{\{root:a'\}_\alpha} * \text{tree}_{pe}(0,a',b',0)_\beta * \text{true}_Y) \quad \wedge \\ (q_1 \xrightarrow{\{\text{next}:c', \text{prev}:d'\}_\alpha} * \text{ls}_{pe}(q_1,c',d',q_1)_\beta * \text{ls}_{ne}(e',q_2,e',q_2)_Y)$$

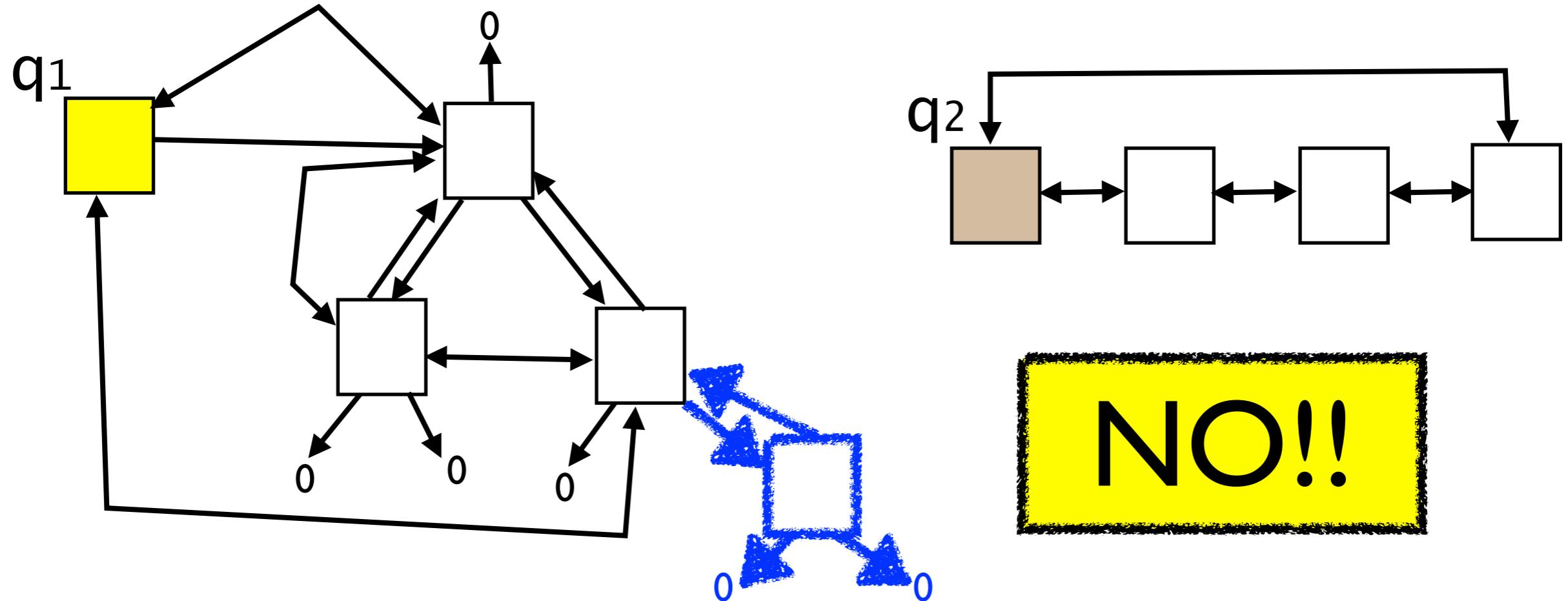
# Loose correlation


$$(q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\ (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)$$

# Loose correlation


$$(q_1 \xrightarrow{\{\text{root:}a'\}_\alpha} * \text{tree}_{\text{pe}}(0,a',b',0)_\beta * \text{true}_Y) \quad \wedge \\ (q_1 \xrightarrow{\{\text{next:}c', \text{prev:}d'\}_\alpha} * \text{ls}_{\text{pe}}(q_1,c',d',q_1)_\beta * \text{ls}_{\text{ne}}(e',q_2,e',q_2)_Y)$$

# Loose correlation



$$(q_1 \xrightarrow{\{root:a'\}_\alpha} * \text{tree}_{pe}(0,a',b',0)_\beta * \text{true}_\gamma) \wedge$$

$$(q_1 \xrightarrow{\{next:c', prev:d'\}_\alpha} * \text{ls}_{pe}(q_1,c',d',q_1)_\beta * \text{ls}_{ne}(e',q_2,e',q_2)_\gamma)$$

# Abstract domain

$$(q_1 \mapsto \{ \text{root}:a' \}_\alpha * \text{tree}_{pe}(0,a',b',0)_\beta * \text{true}_Y) \quad \wedge \\ (q_1 \mapsto \{ \text{next}:c', \text{prev}:d' \}_\alpha * \text{ls}_{pe}(q_1,c',d',q_1)_\beta * \text{ls}_{ne}(e',q_2,e',q_2)_Y)$$

# Abstract domain

$$(q_1 \mapsto \{ \text{root}: 0 \}_\alpha * \text{true}_\gamma$$
$$\vee \dots$$
$$\vee q_1 \mapsto \{ \text{root}: a' \}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_\gamma) \wedge$$
$$(q_1 \mapsto \{ \text{next}: c', \text{prev}: d' \}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_\gamma$$
$$\vee \dots \vee q_1 \mapsto \{ \text{next}: q_1, \text{prev}: q_1 \}_\alpha * \text{ls}_{\text{ne}}(f', q_2, f', q_2)_\gamma )$$

# Abstract domain

$$\text{Dom} = \text{P(TreeForm)} \times \text{P(ListForm)} \cup \{\top\}$$

$(q_1 \mapsto \{\text{root}:0\}_\alpha * \text{true}_Y$

$\vee \dots$

$\vee q_1 \mapsto \{\text{root}:a'\}_\alpha * \text{tree}_{pe}(0,a',b',0)_\beta * \text{true}_Y) \wedge$

$(q_1 \mapsto \{\text{next}:c',\text{prev}:d'\}_\alpha * \text{ls}_{pe}(q_1,c',d',q_1)_\beta * \text{ls}_{ne}(e',q_2,e',q_2)_Y$

$\vee \dots \vee q_1 \mapsto \{\text{next}:q_1,\text{prev}:q_1\}_\alpha * \text{ls}_{ne}(f',q_2,f',q_2)_Y )$

# Analysis of request move

Run tree and list analyses as separately as possible.

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq);  
    tree_del(q1, rq);  
    list_insert(q2, rq); }
```

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    list_insert(q2, rq); }  
}
```

# Analysis of request move

Run tree and list analyses as separately as possible.

## I. Insert moveInfo and transfer.

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq); }
```

# Analysis of request move

Run tree and list analyses as separately as possible.

1. Insert moveInfo and transfer.

2. Do the main analysis. This can insert the unification of ghost variables.

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq); }
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# Analysis of request move

Run tree and list analyses as separately as possible.

1. Insert moveInfo and transfer.

2. Do the main analysis. This can insert the unification of ghost variables.

SomeTreeForm  $\wedge$  ( $\dots * \text{Is}_{\text{ne}}(\dots, q_2, \dots)$ )<sub>Y</sub> from prev slide

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq); }
```

# Analysis of request move

Run tree and list analyses as separately as possible.

1. Insert moveInfo and transfer.

2. Do the main analysis. This can insert the unification of ghost variables.

SomeTreeForm  $\wedge$  ( $\dots * \text{Is}_{\text{ne}}(\dots, q_2, \dots)_{\gamma}$ ) from prev slide

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq);  $\gamma \leftarrow \gamma \cup \delta$ ; }  
}
```

# Analysis of request move

Run tree and list analyses as separately as possible.

1. Insert moveInfo and transfer.
2. Do the main analysis. This can insert the unification of ghost variables.

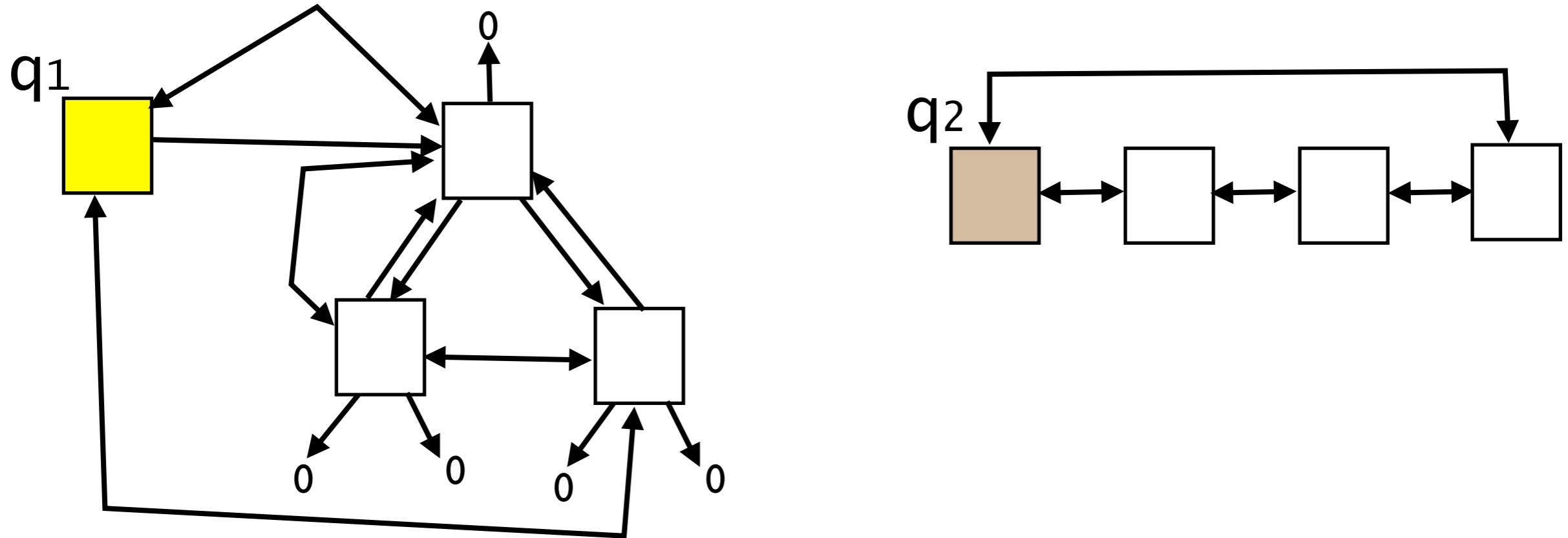
SomeTreeForm  $\wedge$  ( $\dots * \text{Is}_{\text{ne}}(\dots, q_2, \dots)_{\gamma}$ ) from prev slide

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq); γ ← γ ∪ δ; }
```

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

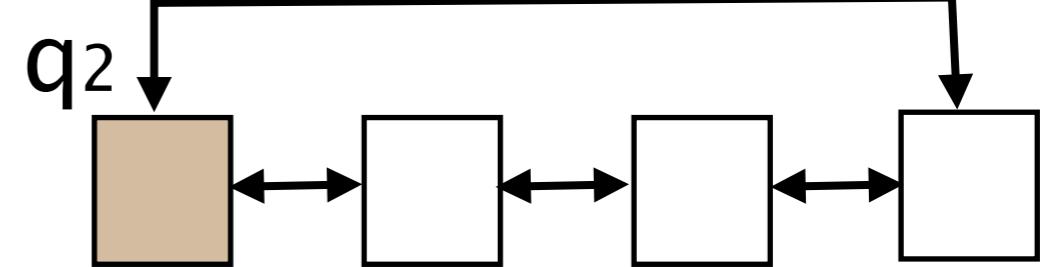
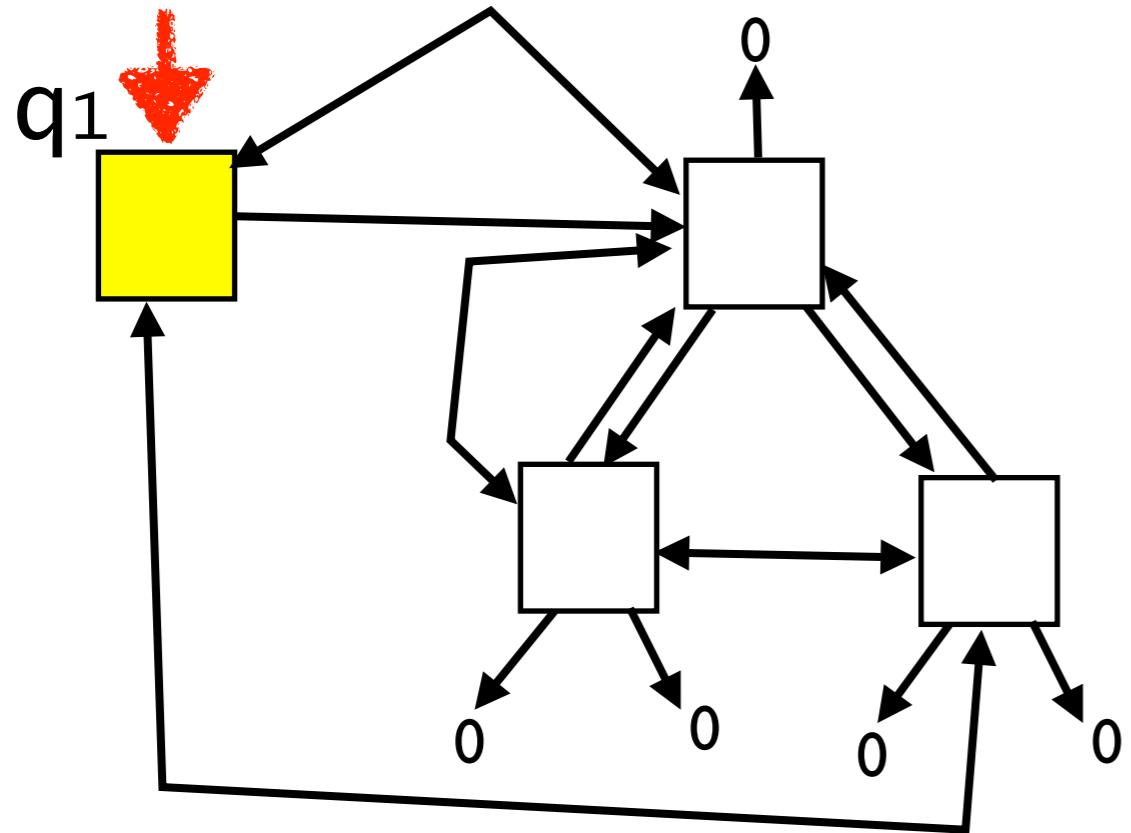
```



$$\begin{aligned}
& (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)
\end{aligned}$$

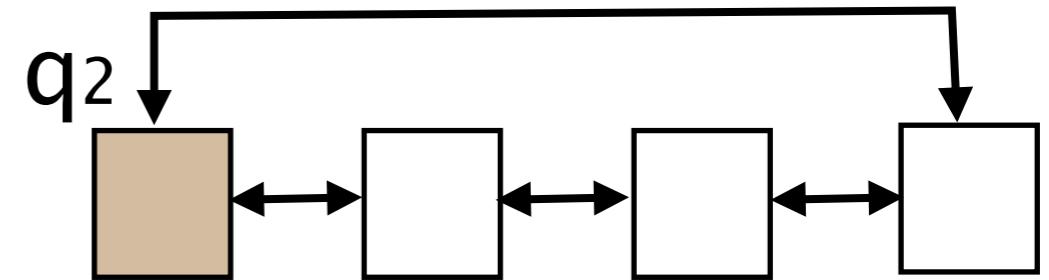
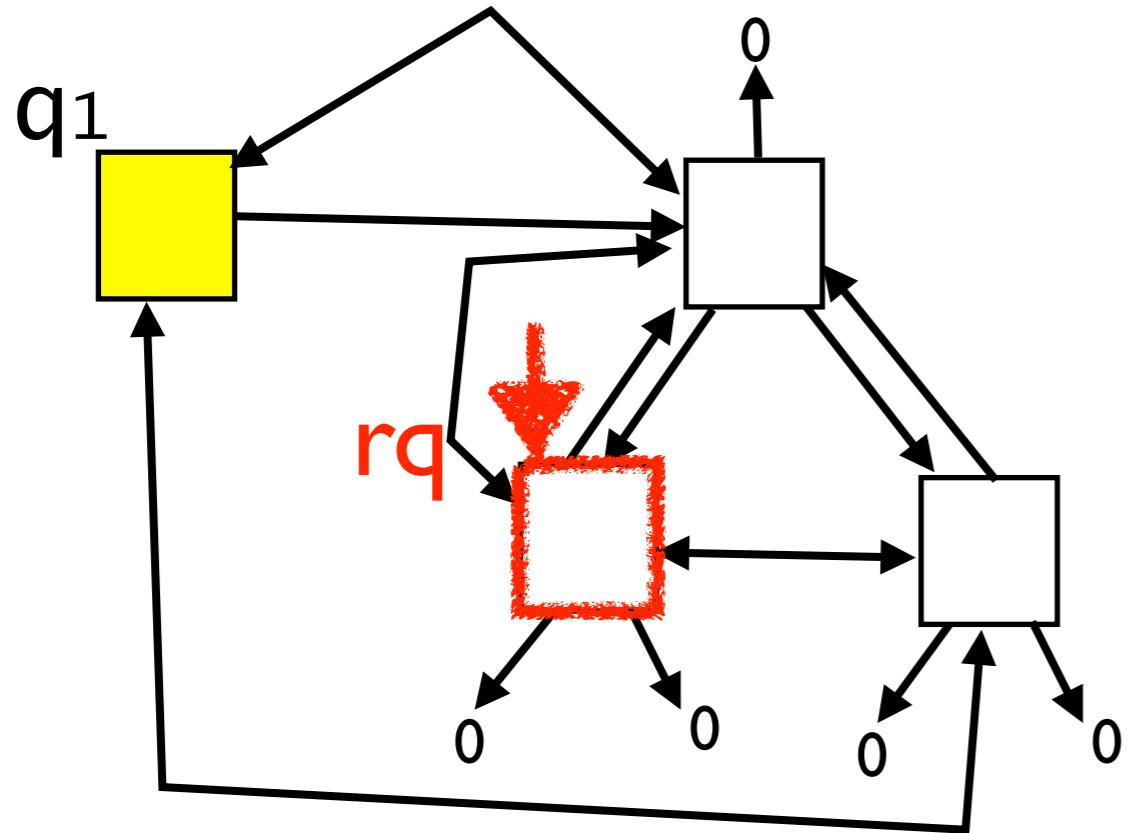
`rq=find(q1, key);`

```
list_del(q1, rq); moveInfo(2,1,rq);
tree_del(q1, rq); transfer(rq, δ);
list_insert(q2, rq);
```


$$(q_1 \mapsto \{ \text{root: } a' \}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge$$
$$(q_1 \mapsto \{ \text{next: } c', \text{prev: } d' \}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)$$

`rq=find(q1, key);`

```
list_del(q1, rq); moveInfo(2,1,rq);
tree_del(q1, rq); transfer(rq, δ);
list_insert(q2, rq);
```

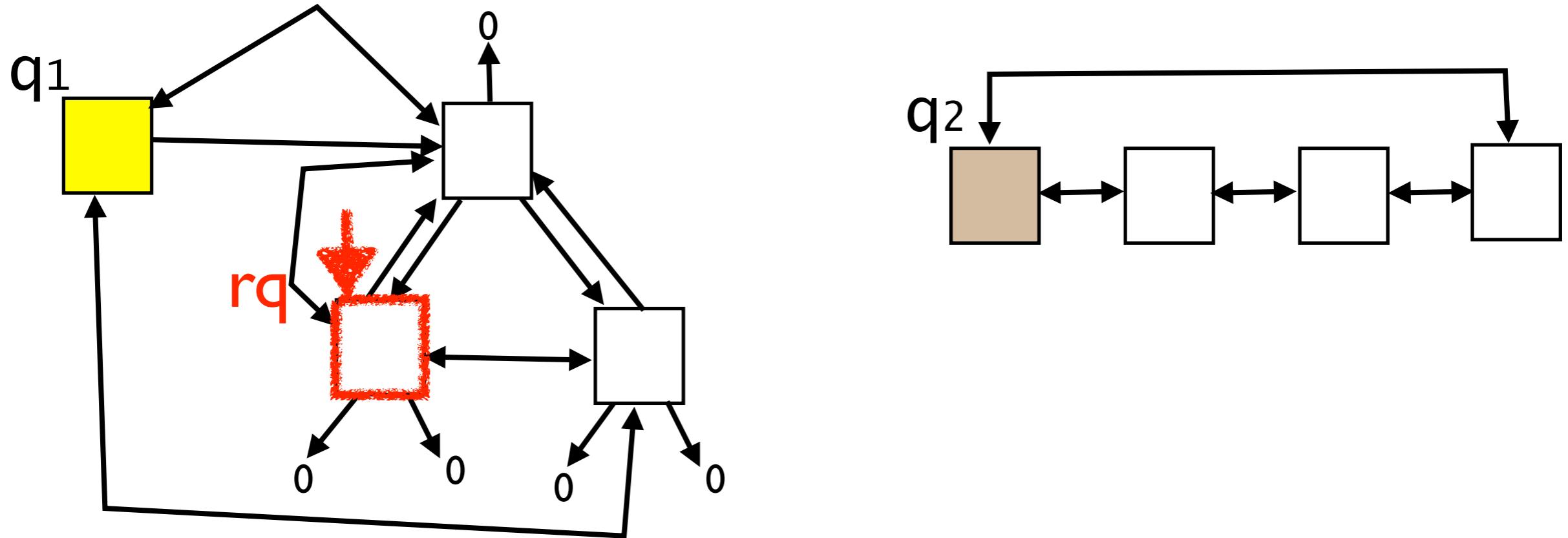


$$(q_1 \xrightarrow{\text{root: } a'} \alpha * \text{tree}_{\text{pe}}(0, a', b', 0) \beta * \text{true}_Y) \quad \wedge \\ (q_1 \xrightarrow{\text{next: } c', \text{prev: } d'} \alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1) \beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2) \gamma)$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```

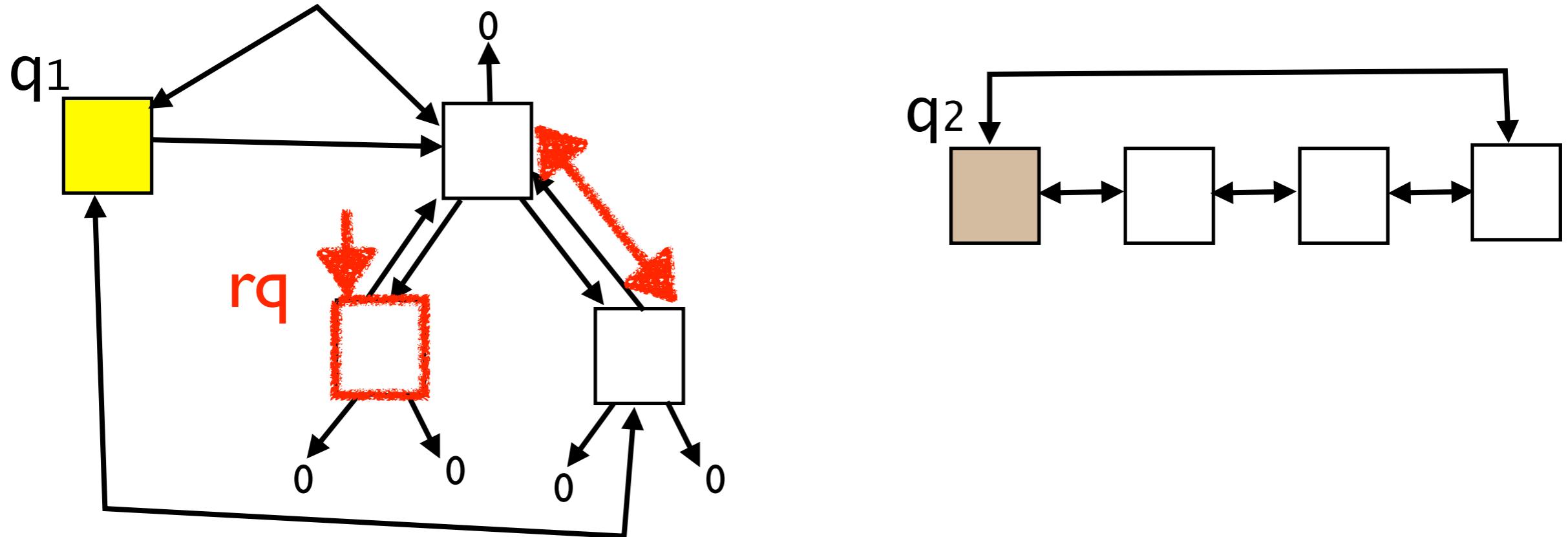


$$\begin{aligned}
& (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)
\end{aligned}$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```

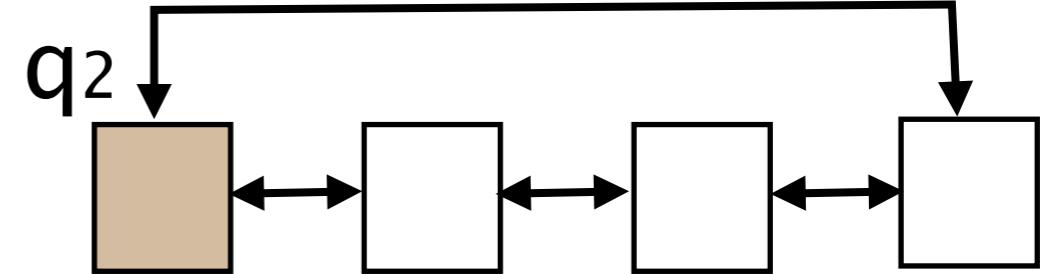
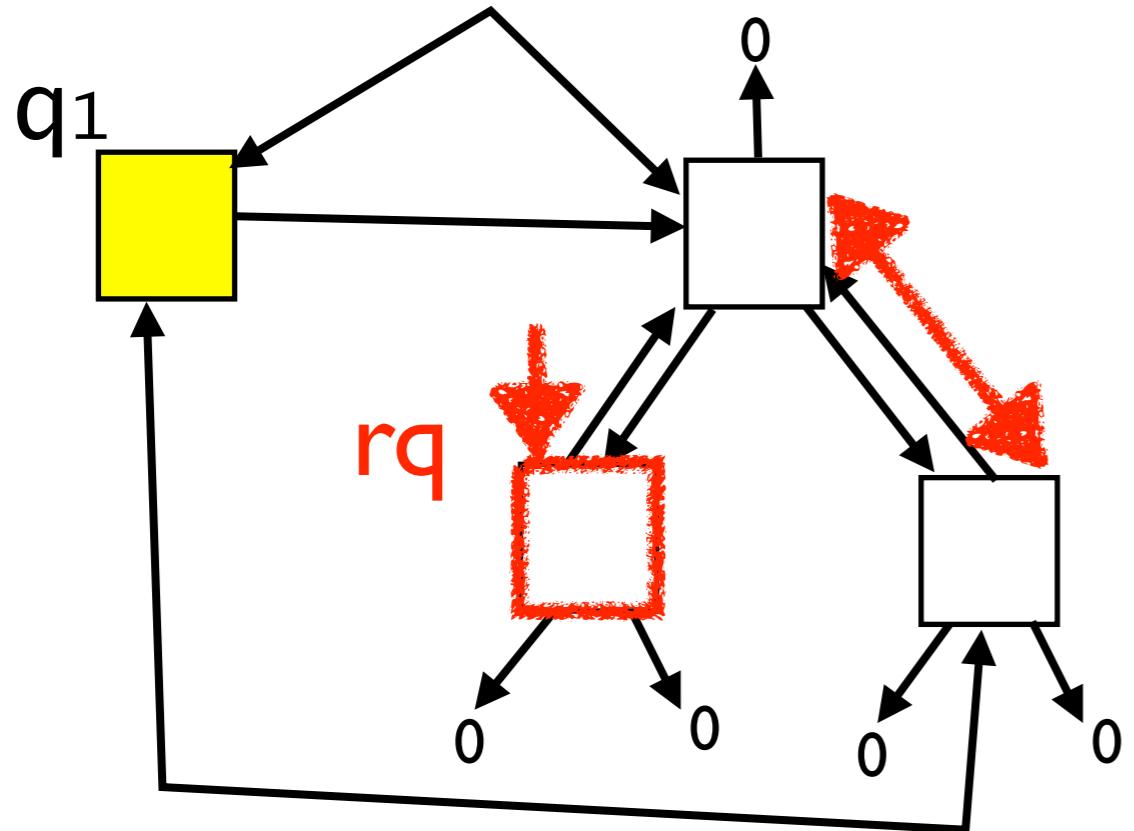


$$\begin{aligned}
& (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)
\end{aligned}$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```

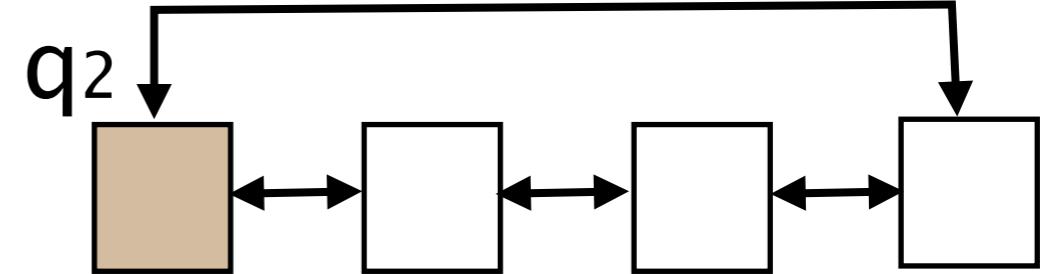
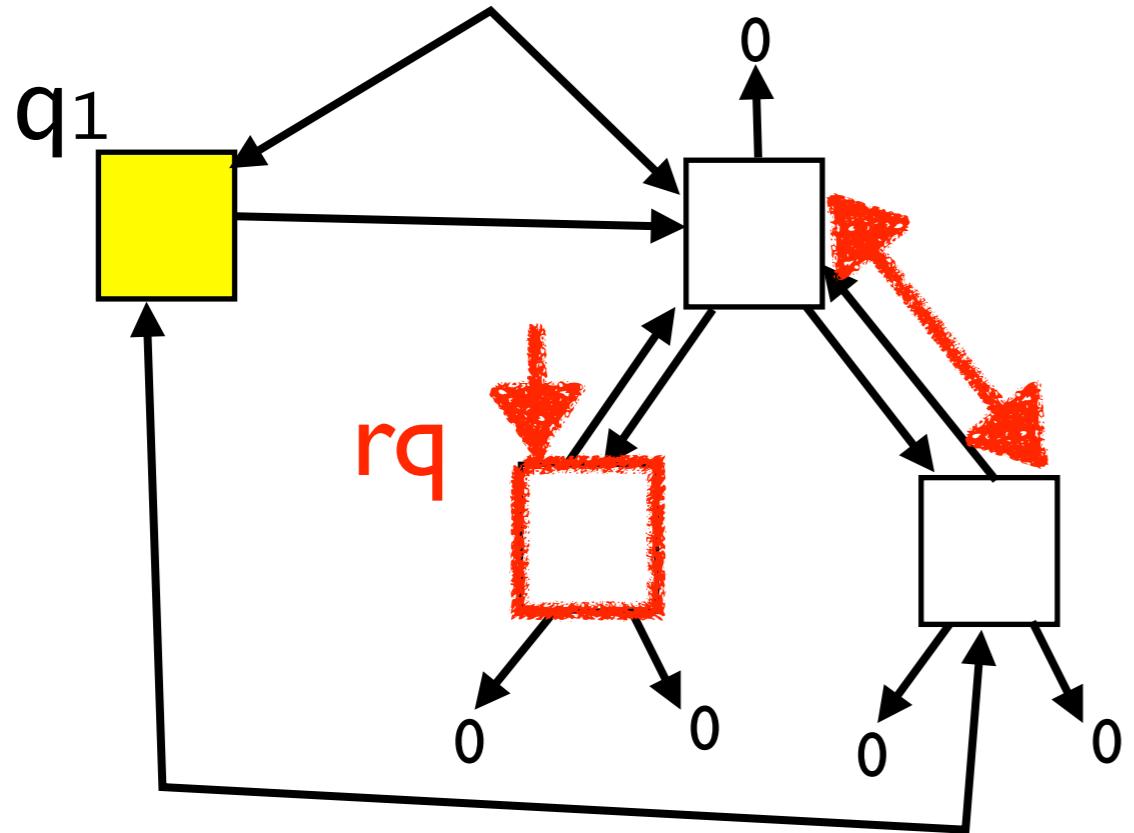


$$\begin{aligned}
& (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)
\end{aligned}$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```

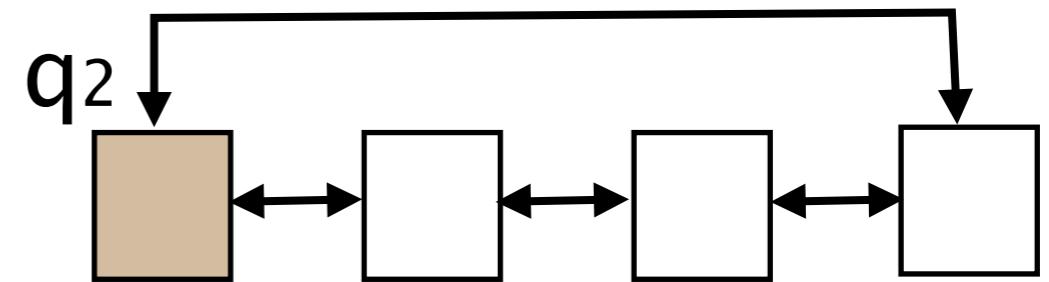
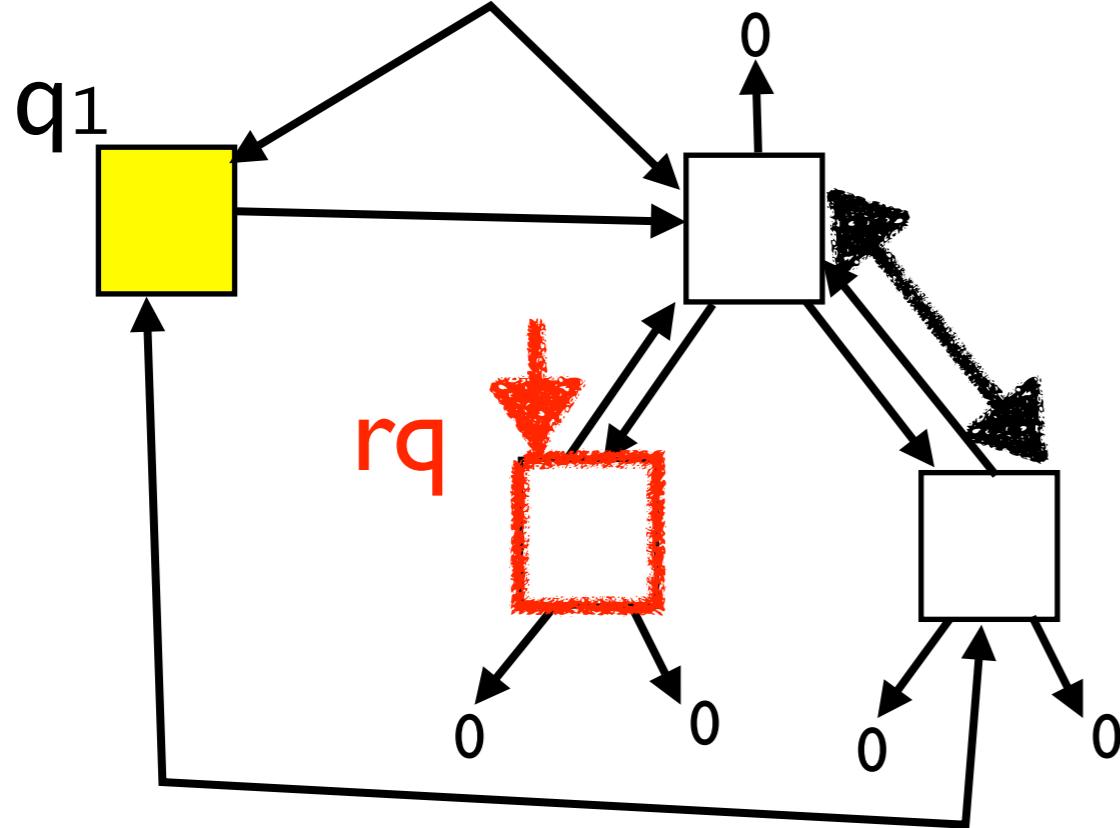


$$\begin{aligned}
& (q_1 \mapsto \{\text{root}:a'\}_\alpha * \text{tree}_{\text{pe}}(0,a',b',0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next}:c', \text{prev}:d'\}_\alpha * \text{ls}_{\text{pe}}(q_1,c',d',q_1)_\beta * \text{ls}_{\text{ne}}(e',q_2,e',q_2)_Y) \\
& \quad \text{---} \\
& \quad \text{ls}_{\text{pe}}(q_1,c',d',q_1)_\beta * \text{rq} \mapsto \{\text{next}:d'_1, \text{prev}:c'_1\}_\beta
\end{aligned}$$

```

rq=find(q1,key);
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tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```

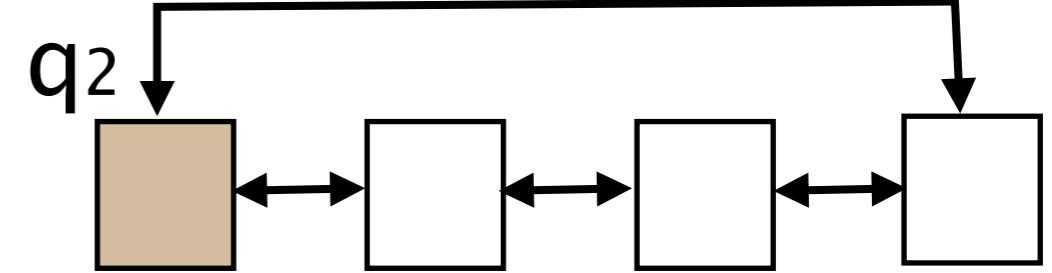
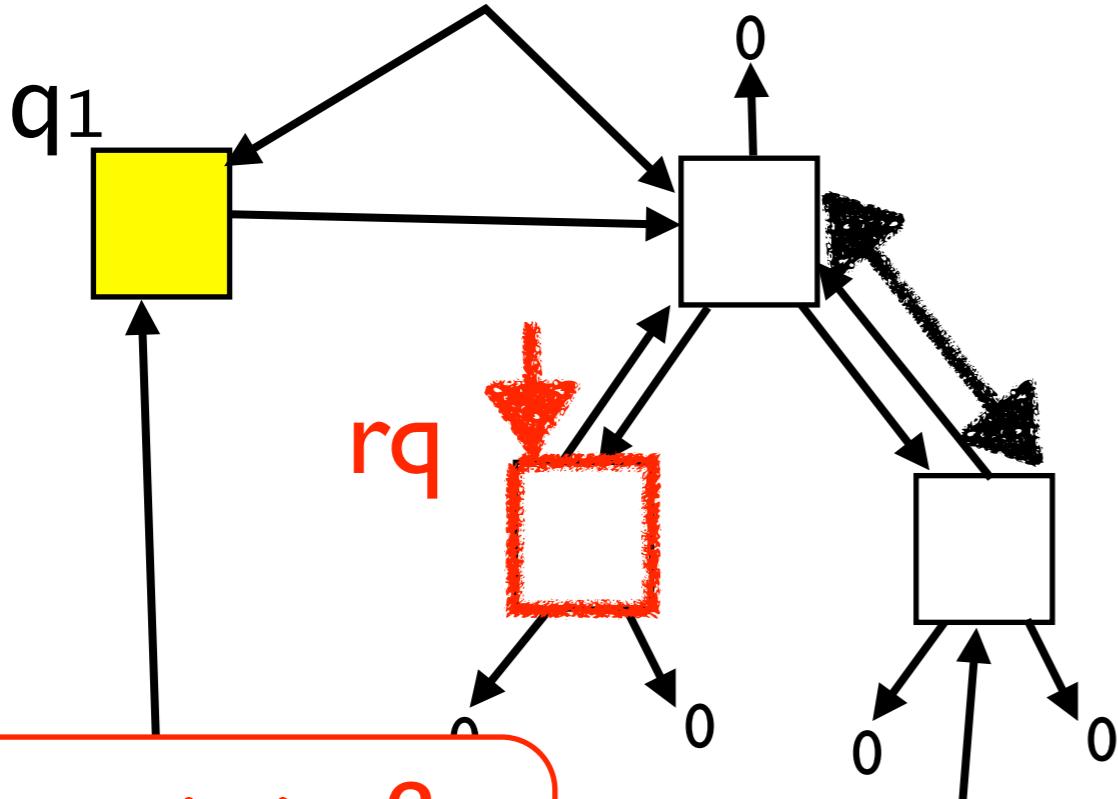


$$\begin{aligned}
 & (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
 & (\underbrace{q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y}_{\text{moveInfo}(2, 1, rq)} \\
 & \quad \wedge \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{rq} \mapsto \{\text{next: } d'_1, \text{prev: } c'_1\}_\beta)
 \end{aligned}$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



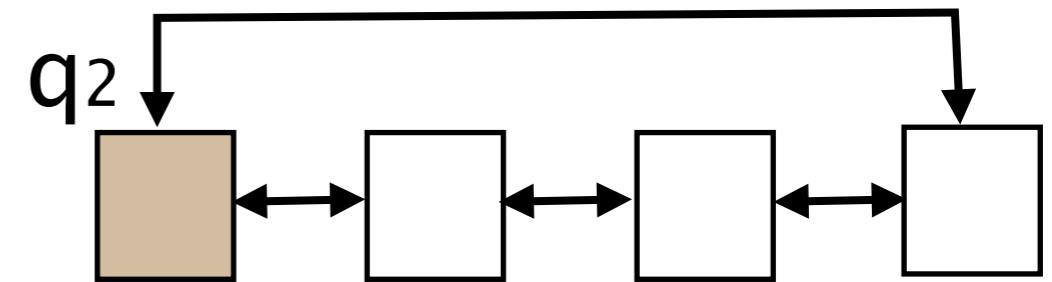
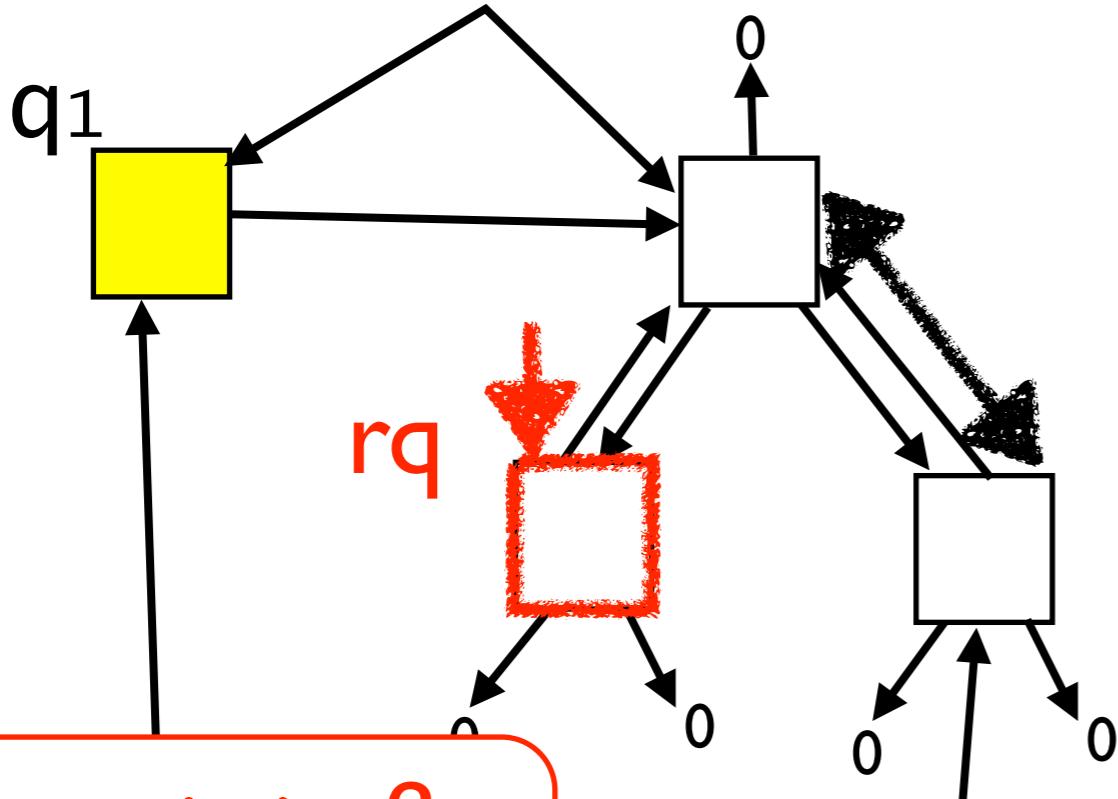
**rq is in  $\beta$**

$(q_1 \mapsto \{ \text{root: } a' \}^\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)^\beta * \text{true}_Y) \wedge$   
 ~~$(q_1 \mapsto \{ \text{next: } c', \text{prev: } d' \}^\alpha * \text{ls}_{\text{de}}(q_1, c', d', q_1)^\beta * \text{ls}_{\text{ne}}(e', q_2, e', q_2)_Y)$~~   
 $\text{ls}_{\text{pe}}(q_1, c', d', q_1)^\beta * \text{rq} \mapsto \{ \text{next: } d'_1, \text{prev: } c'_1 \}^\beta$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



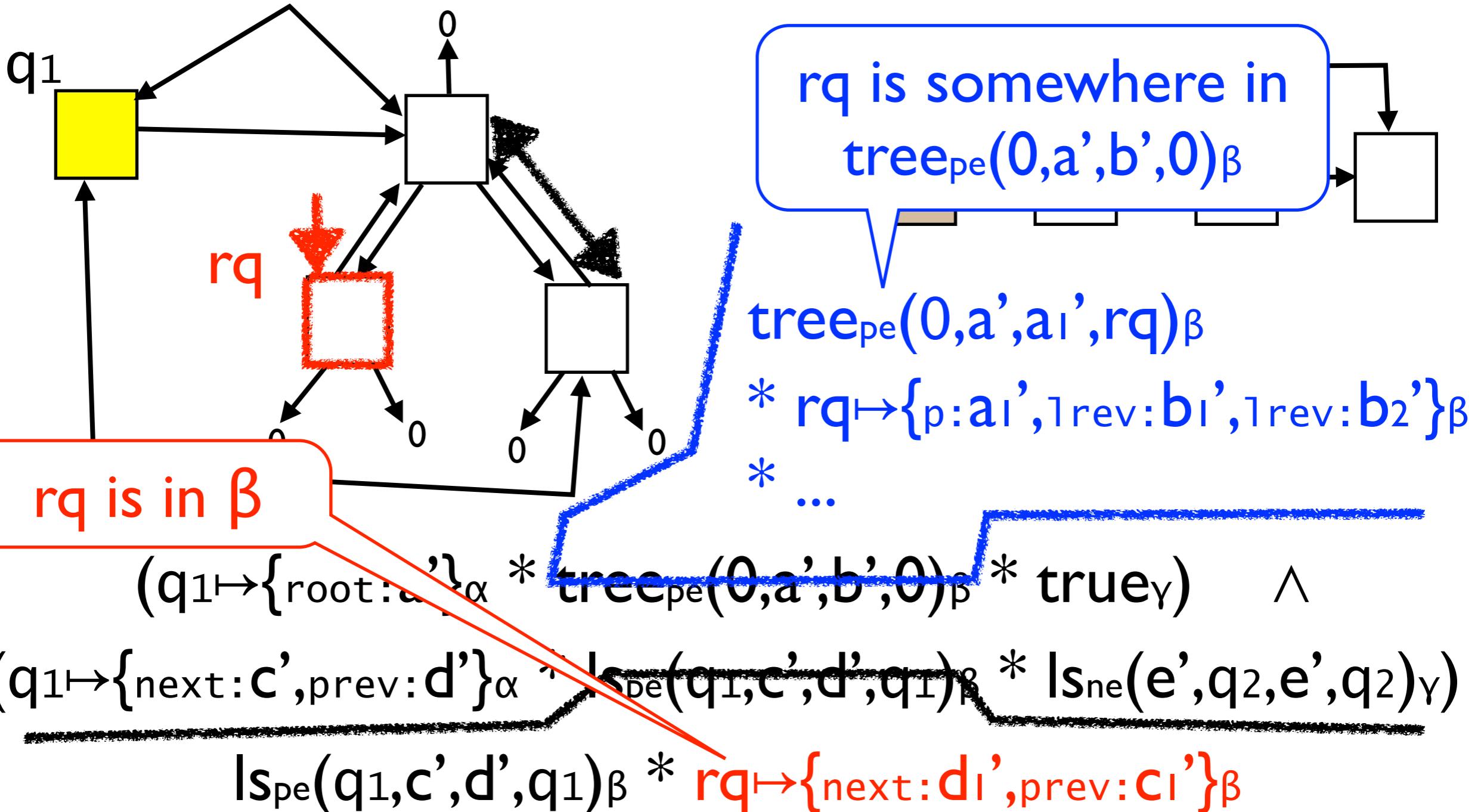
**rq is in  $\beta$**

$(q_1 \mapsto \{root: a'\}_\alpha * \text{tree}_{pe}(0, a', b', 0)_\beta * \text{true}_\gamma) \wedge$   
 ~~$(q_1 \mapsto \{\text{next}: c', \text{prev}: d'\}_\alpha * \text{Is}_{de}(q_1, c', d', q_1)_\beta * \text{Is}_{ne}(e', q_2, e', q_2)_\gamma)$~~   
 $\text{Is}_{pe}(q_1, c', d', q_1)_\beta * \text{rq} \mapsto \{\text{next}: d'_1, \text{prev}: c'_1\}_\beta$

```

rq=find(q1,key);
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tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

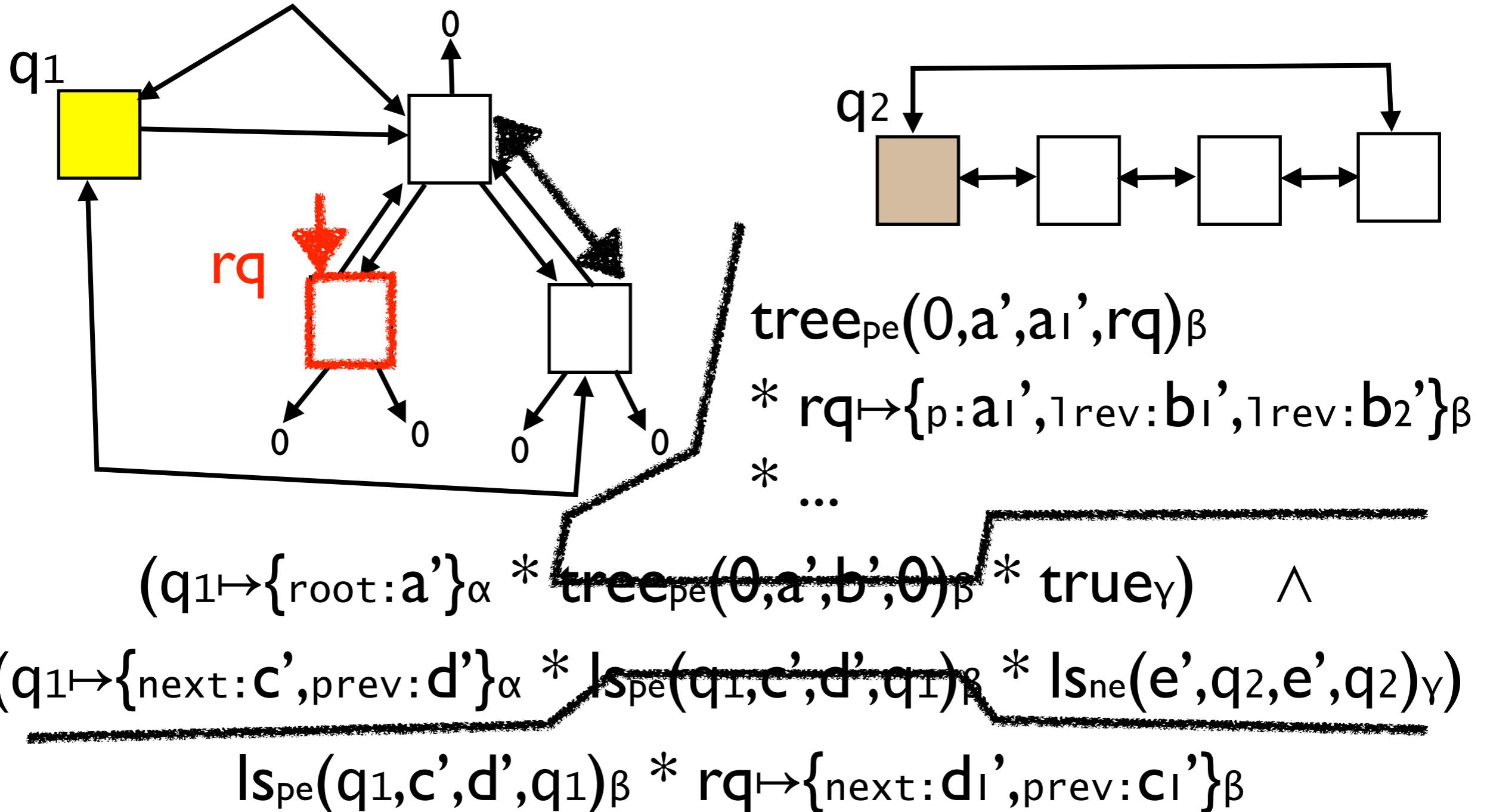
```



```

rq=find(q1,key);
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tree_del(q1,rq); transfer(rq, δ);
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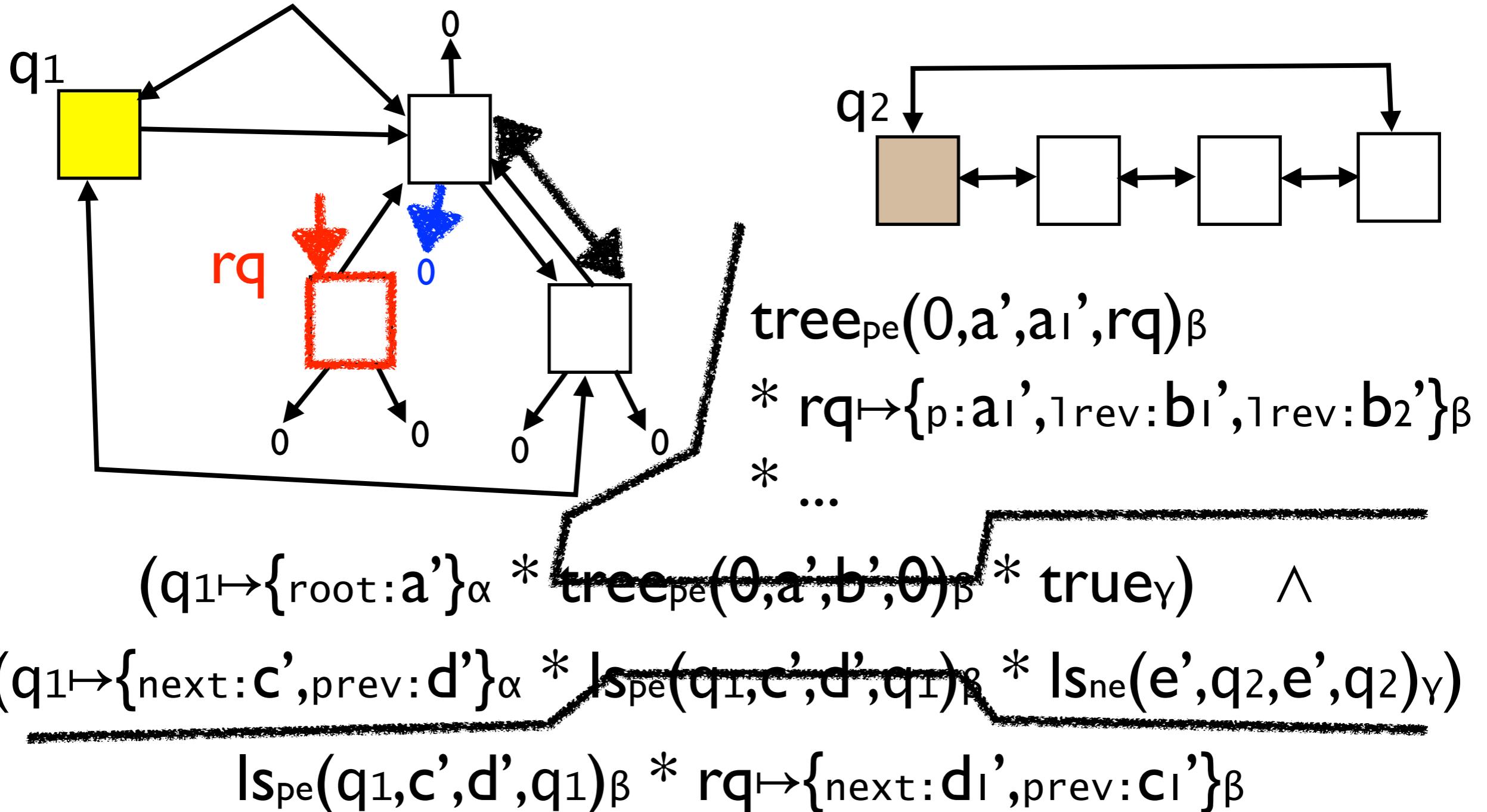
```



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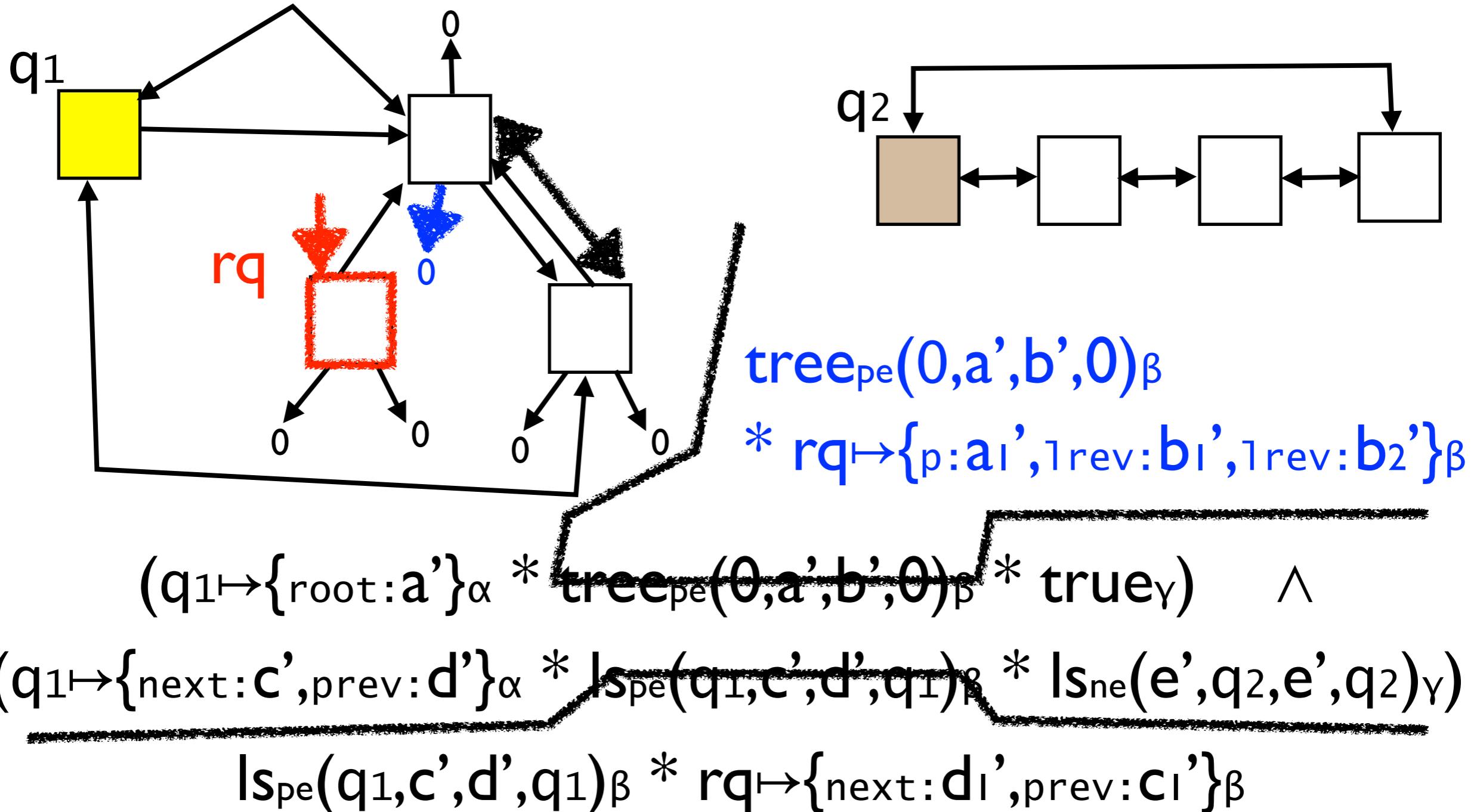
```



```

rq=find(q1,key);
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tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

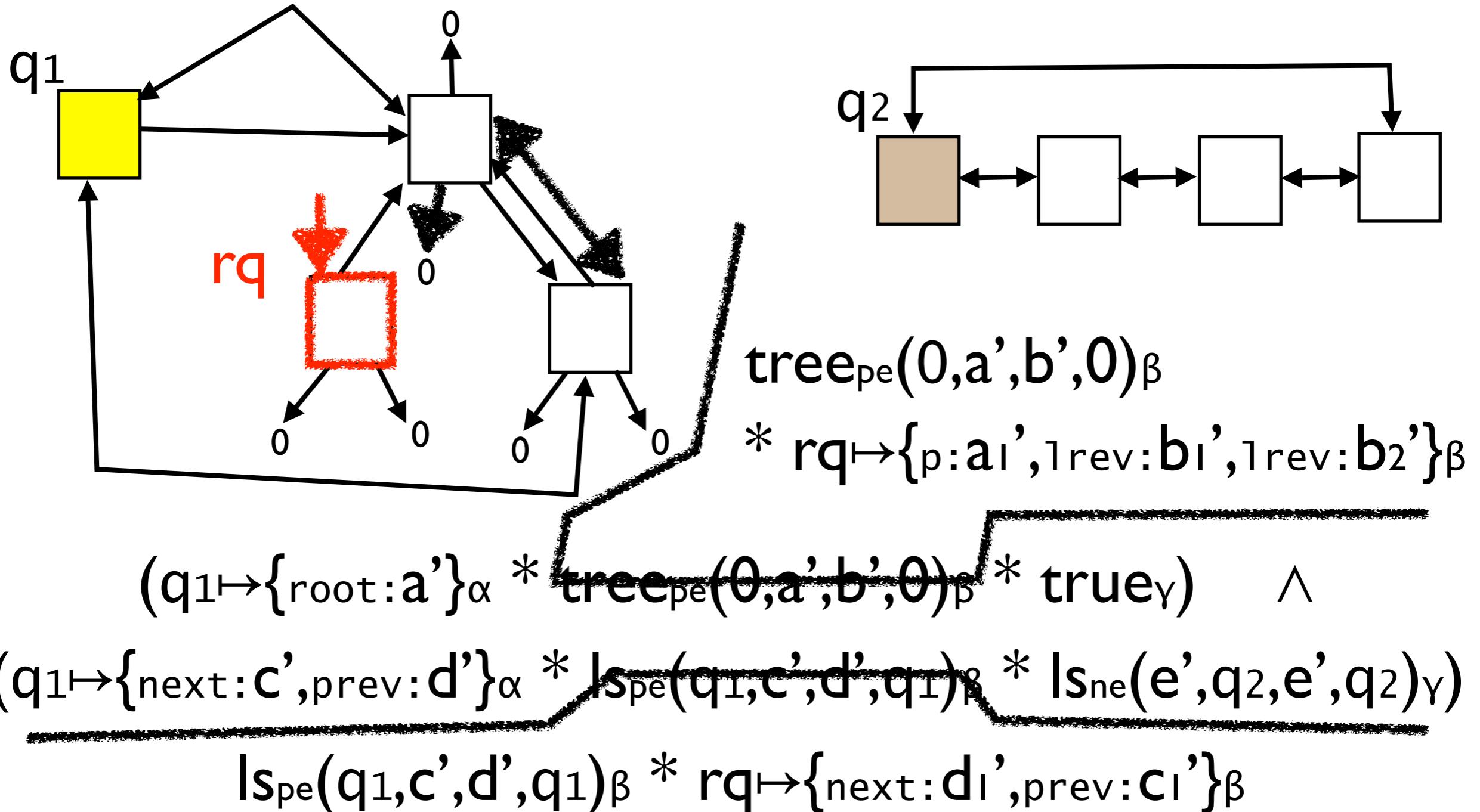
```



```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

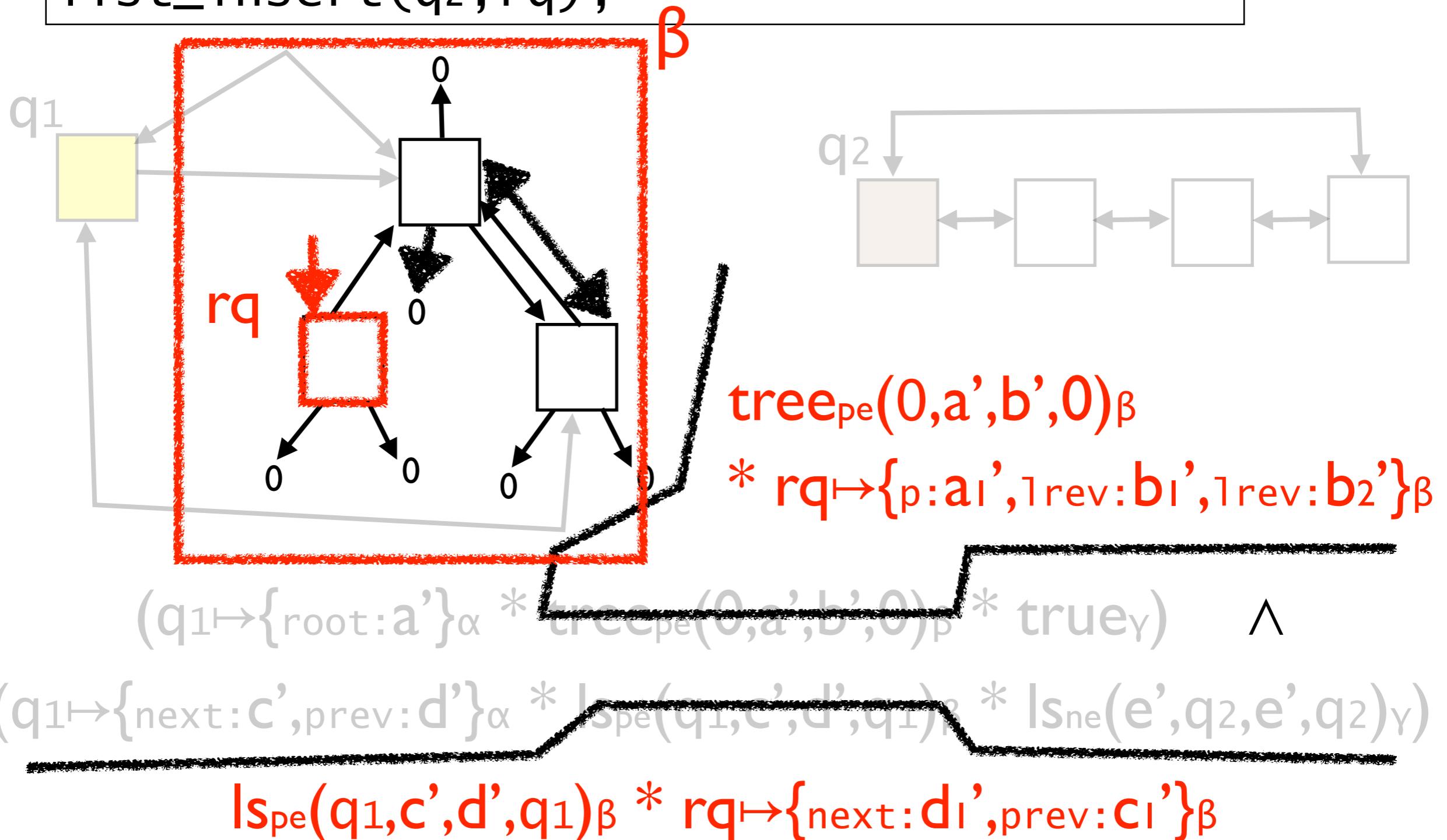
```



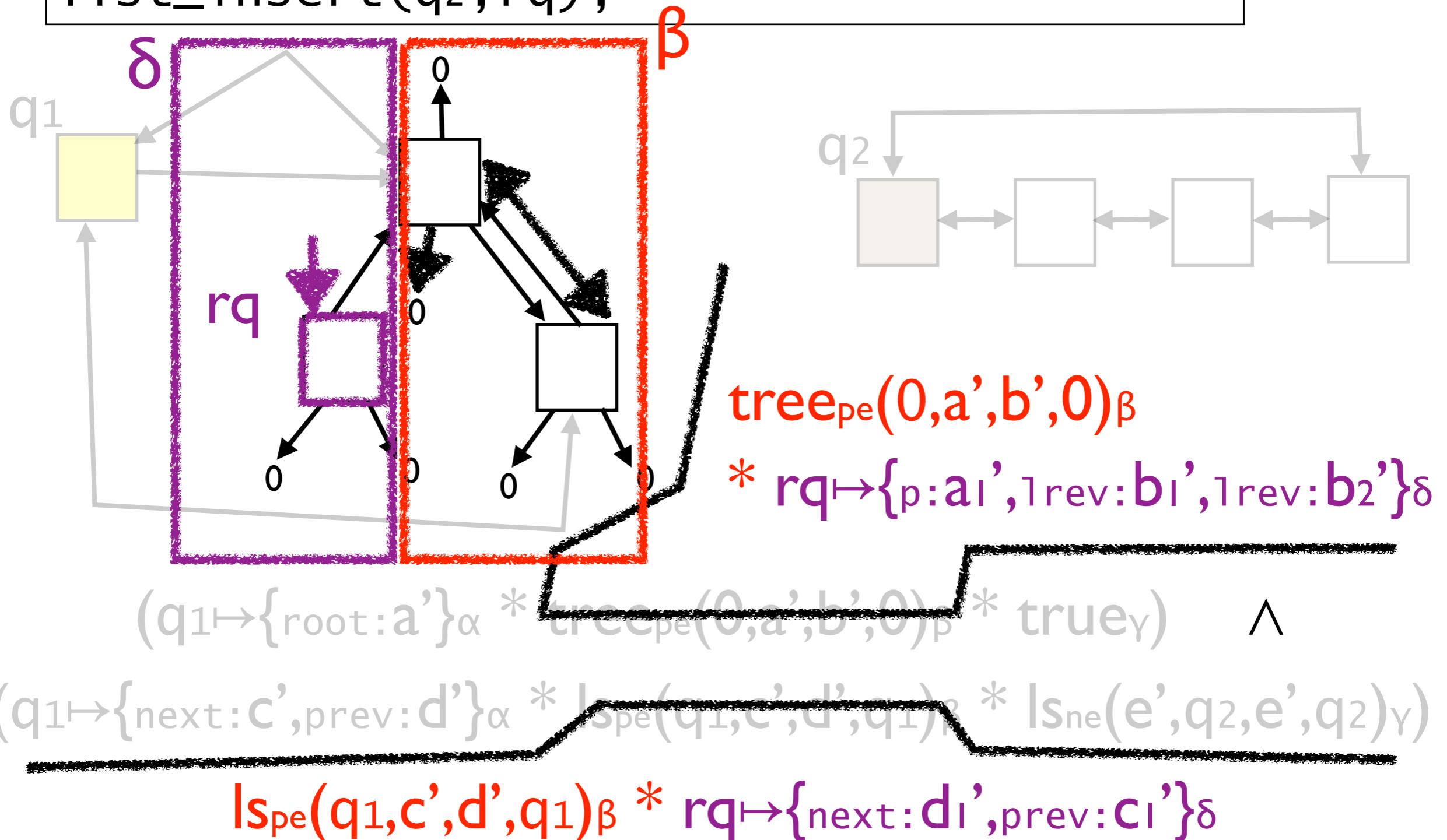
```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



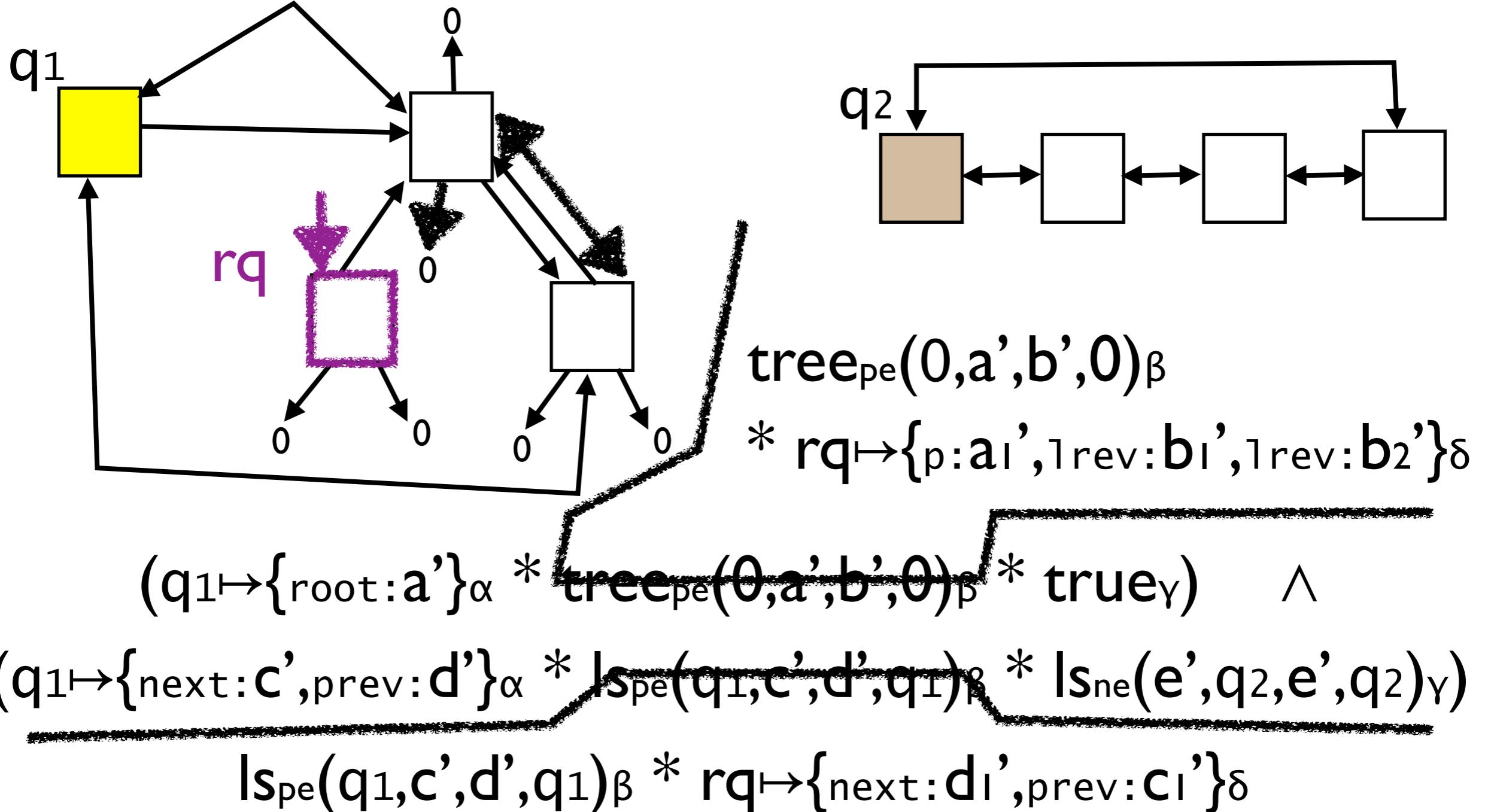
```
rq=find(q1,key);  
list_del(q1,rq); moveInfo(2,1,rq);  
tree_del(q1,rq); transfer(rq, δ);  
list_insert(q2,rq);
```



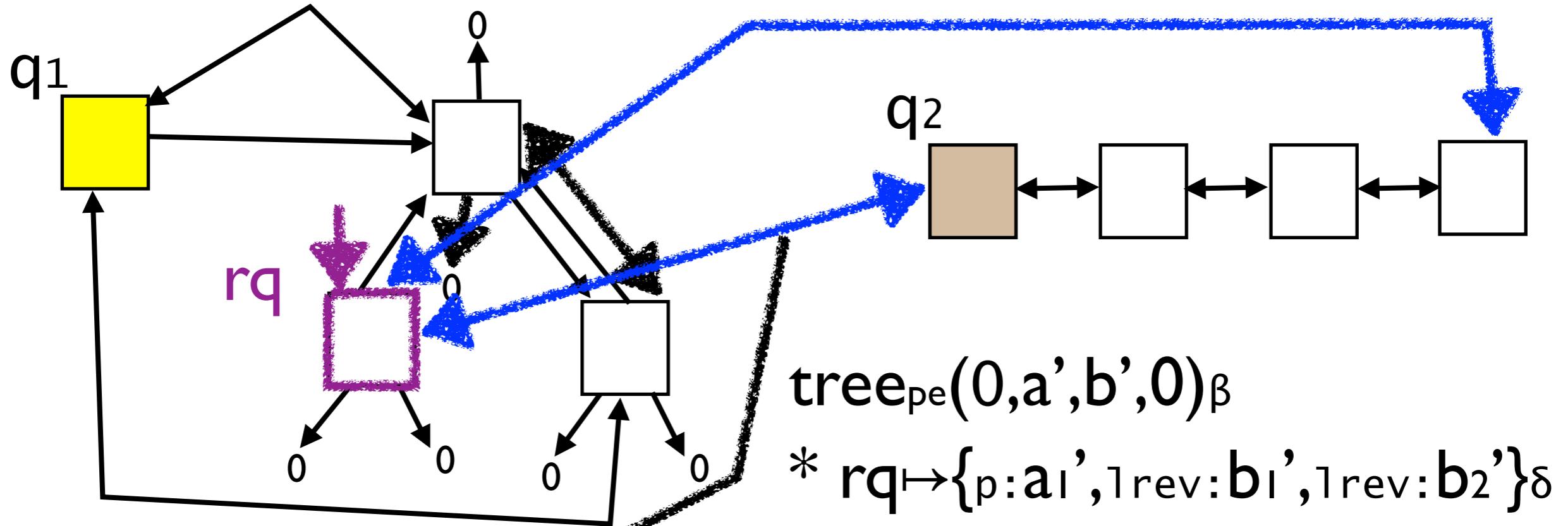
```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



```
rq=find(q1,key);  
list_del(q1,rq); moveInfo(2,1,rq);  
tree_del(q1,rq); transfer(rq, δ);  
list_insert(q2,rq);
```



$(q_1 \mapsto \{root:a'\}_\alpha * \cancel{\text{tree}_{pe}(0,a',b',0)_p} * \text{true}_Y) \quad \wedge$

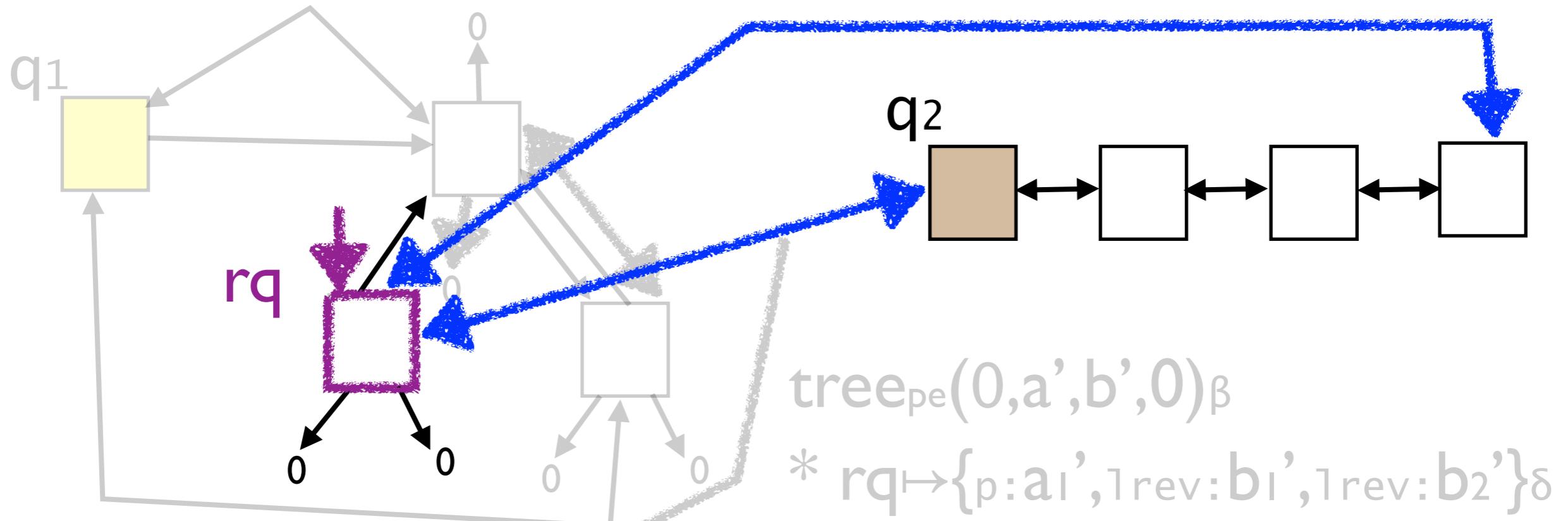
$$(q_1 \mapsto \{next:c', prev:d'\}_\alpha * ls_{pe}(q_1, c', d', q_1)_\beta * ls_{ne}(e', q_2, e', q_2)_\gamma)$$

$Is_{pe}(q_1, c', d', q_1) \beta * rq \mapsto \{next: d_1', prev: c_1'\} \delta$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



$(q_1 \mapsto \{\text{root}:a'\}_{\alpha} * \text{tree}_{pe}(0,a',b',0)_{\beta} * \text{true}_{\gamma}) \wedge$

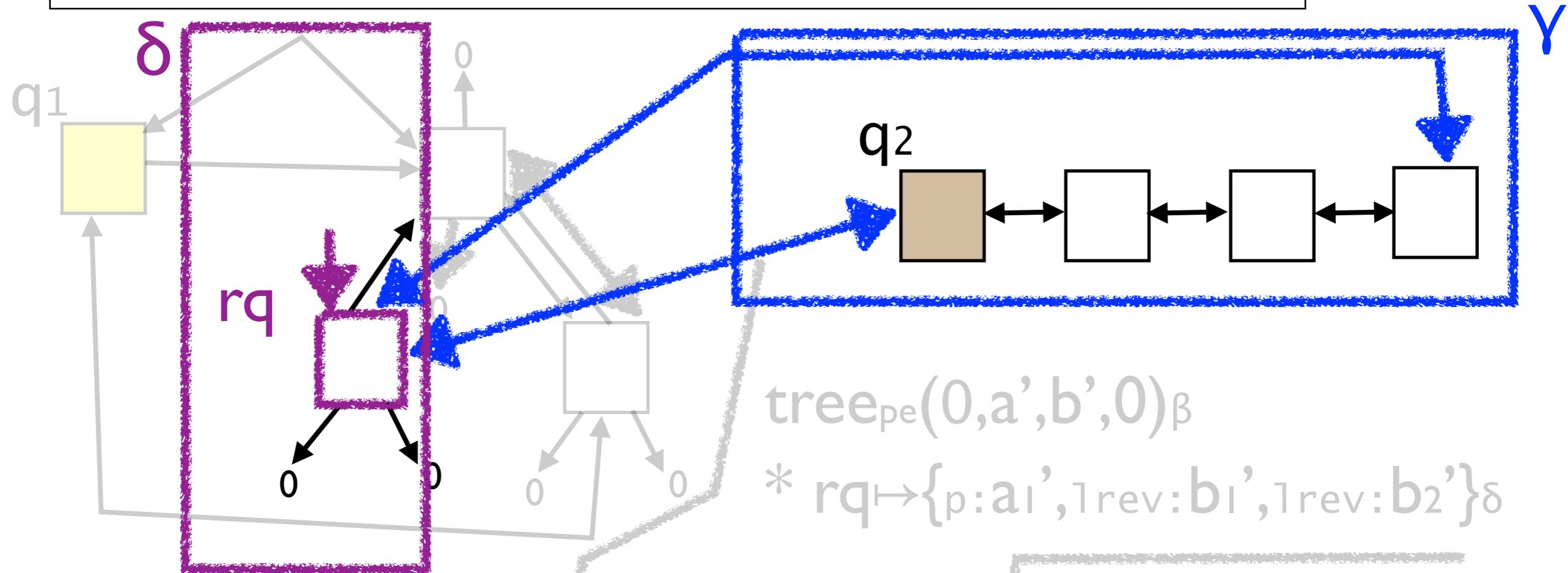
$(q_1 \mapsto \{\text{next}:c', \text{prev}:d'\}_{\alpha} * \text{ls}_{pe}(q_1, c', d', q_1)_{\beta} * \text{ls}_{ne}(rq, q_2, e', rq)_{\gamma})$

$\text{ls}_{pe}(q_1, c', d', q_1)_{\beta} * \text{rq} \mapsto \{\text{next}:q_2, \text{prev}:e'\}_{\delta}$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);

```



Cannot be abstracted to a list, because they belong to different partitions.

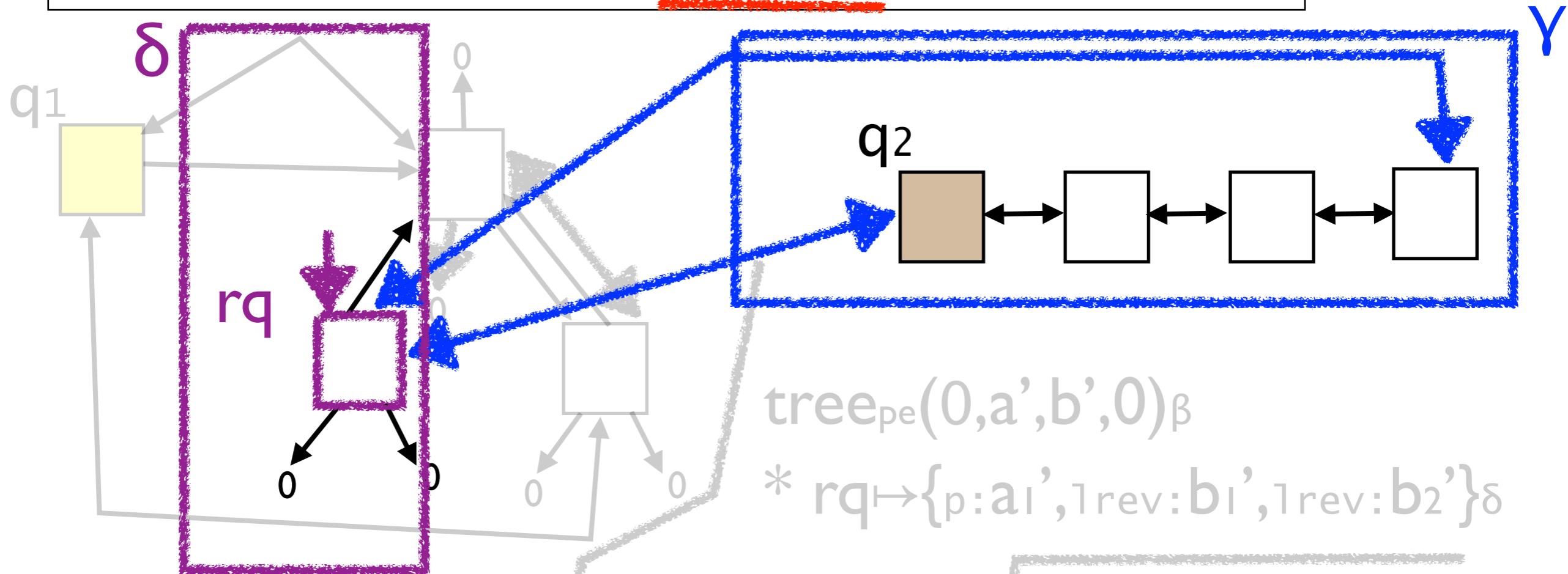
$* \text{rq} \mapsto \{next:q_2, prev:e'\}_{\delta}$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ;

```

Merge  $\Upsilon, \delta$



$tree_{pe}(0,a',b',0)_\beta$

\*  $rq \mapsto \{p:a'_1, lrev:b'_1, rrev:b'_2\}_\delta$

$(a_1 \mapsto \{\text{root}:a'\}_\alpha * tree_{pe}(0,a',b',0)_\beta * \text{true}_\Upsilon) \wedge$

Cannot be abstracted to a list, because they belong to different partitions.

$rq \mapsto \{next:q_2, prev:e'\}_\delta$

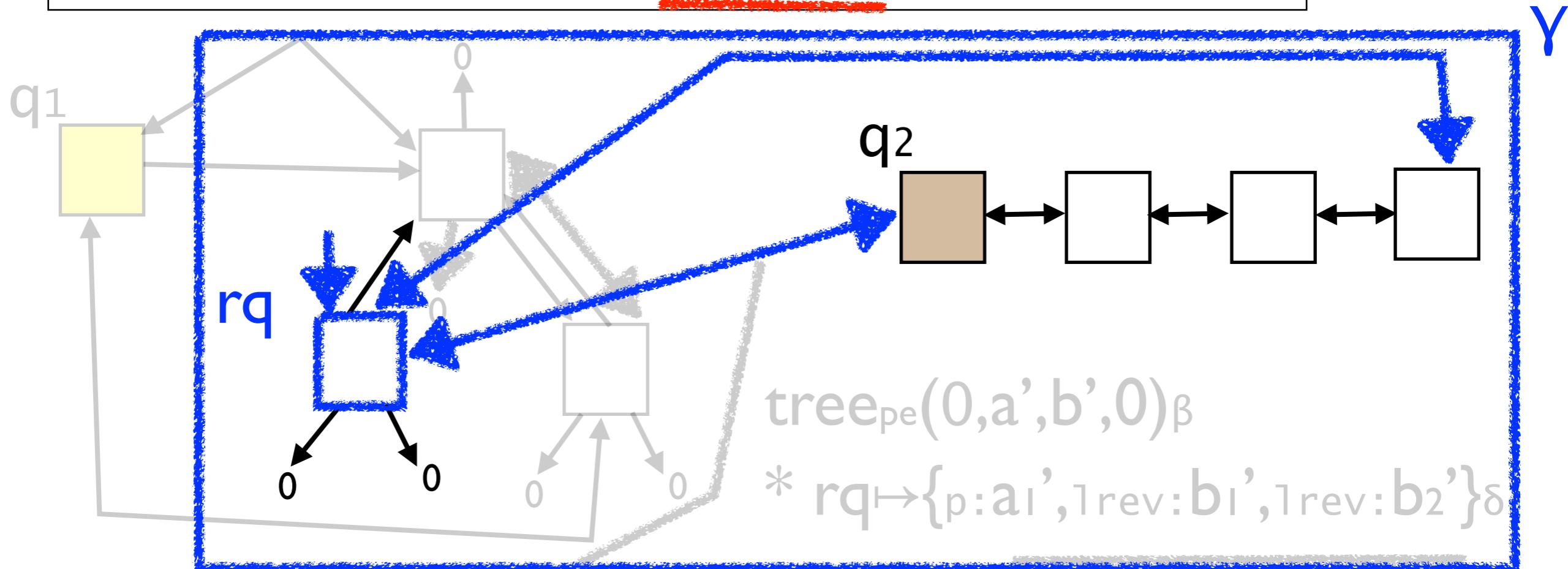
\*  $is_{ne}(rq,q_2,e',rq)_\Upsilon$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ;

```

Merge  $\Upsilon, \delta$



$(q_1 \mapsto \{\text{root: } a'\}_{\alpha} * tree_{pe}(0,a',b',0)_{\beta} * \text{true}_{\Upsilon}) \wedge$

$(q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_{\alpha} * ls_{pe}(q_1, c', d', q_1)_{\beta} * ls_{ne}(rq, q_2, e', rq)_{\Upsilon})$

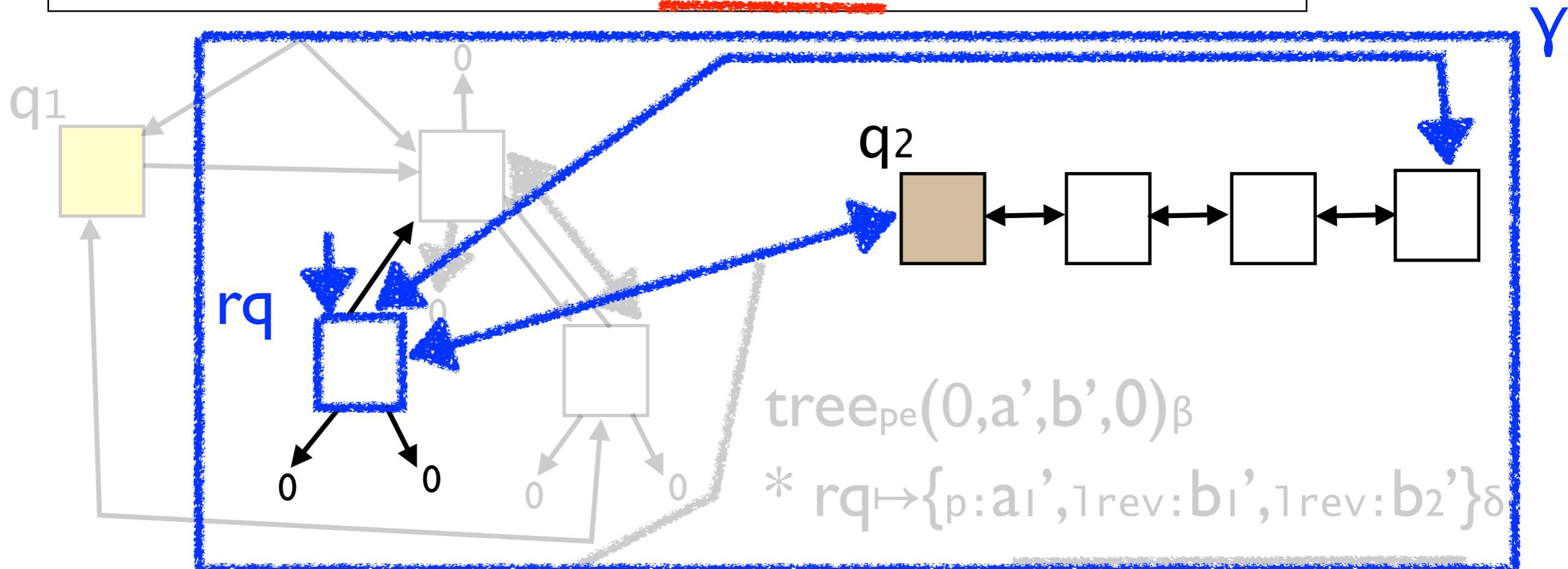
$ls_{pe}(q_1, c', d', q_1)_{\beta} * rq \mapsto \{\text{next: } q_2, \text{prev: } e'\}_{\Upsilon}$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ;

```

Merge  $\Upsilon, \delta$



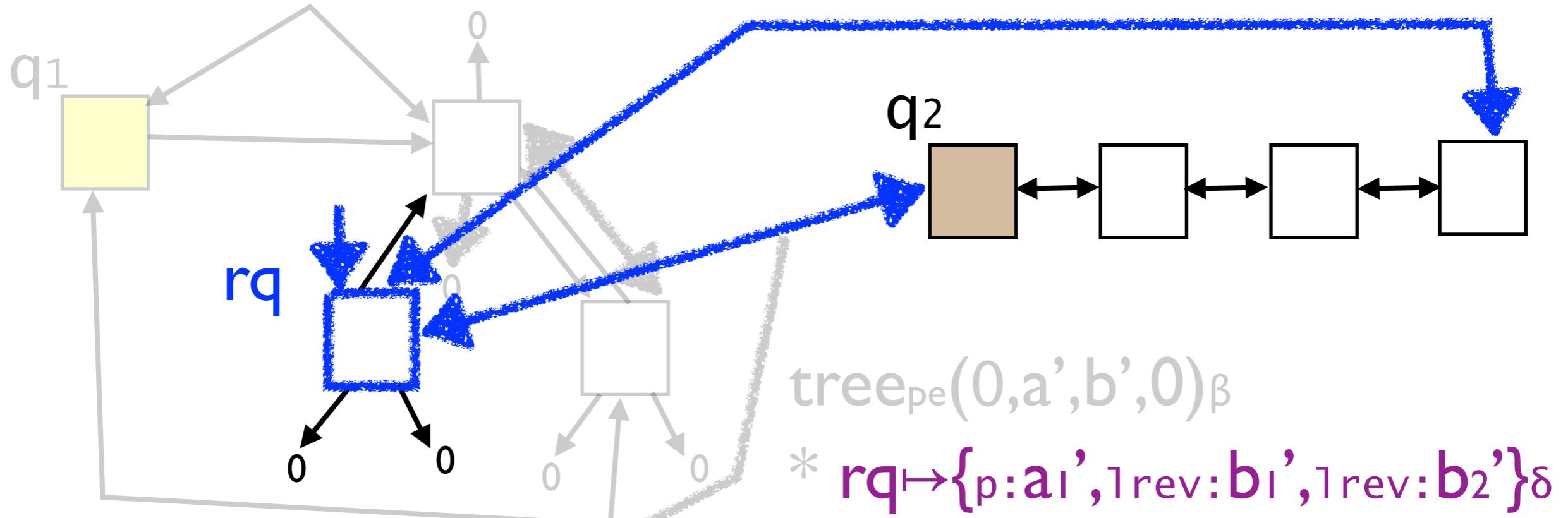
$$\begin{aligned}
& (q_1 \mapsto \{\text{root}:a'\}_\alpha * \text{tree}_{pe}(0,a',b',0)_\beta * \text{true}_\Upsilon) \wedge \\
& (q_1 \mapsto \{\text{next}:c', \text{prev}:d'\}_\alpha * \text{ls}_{pe}(q_1,c',d',q_1)_\beta * \text{ls}_{ne}(rq,q_2,rq,q_2)_\Upsilon) \\
& \quad \text{ls}_{pe}(q_1,c',d',q_1)_\beta
\end{aligned}$$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ;

```

Merge  $\Upsilon, \delta$



$(q_1 \rightarrow \{\text{root}:a'\}_\alpha * tree_{pe}(0,a',b',0)_\beta * \text{true}_\Upsilon) \wedge$

$(q_1 \rightarrow \{\text{next}:c', \text{prev}:d'\}_\alpha * ls_{pe}(q_1,c',d',q_1)_\beta * ls_{ne}(rq,q_2,rq,q_2)_\Upsilon)$

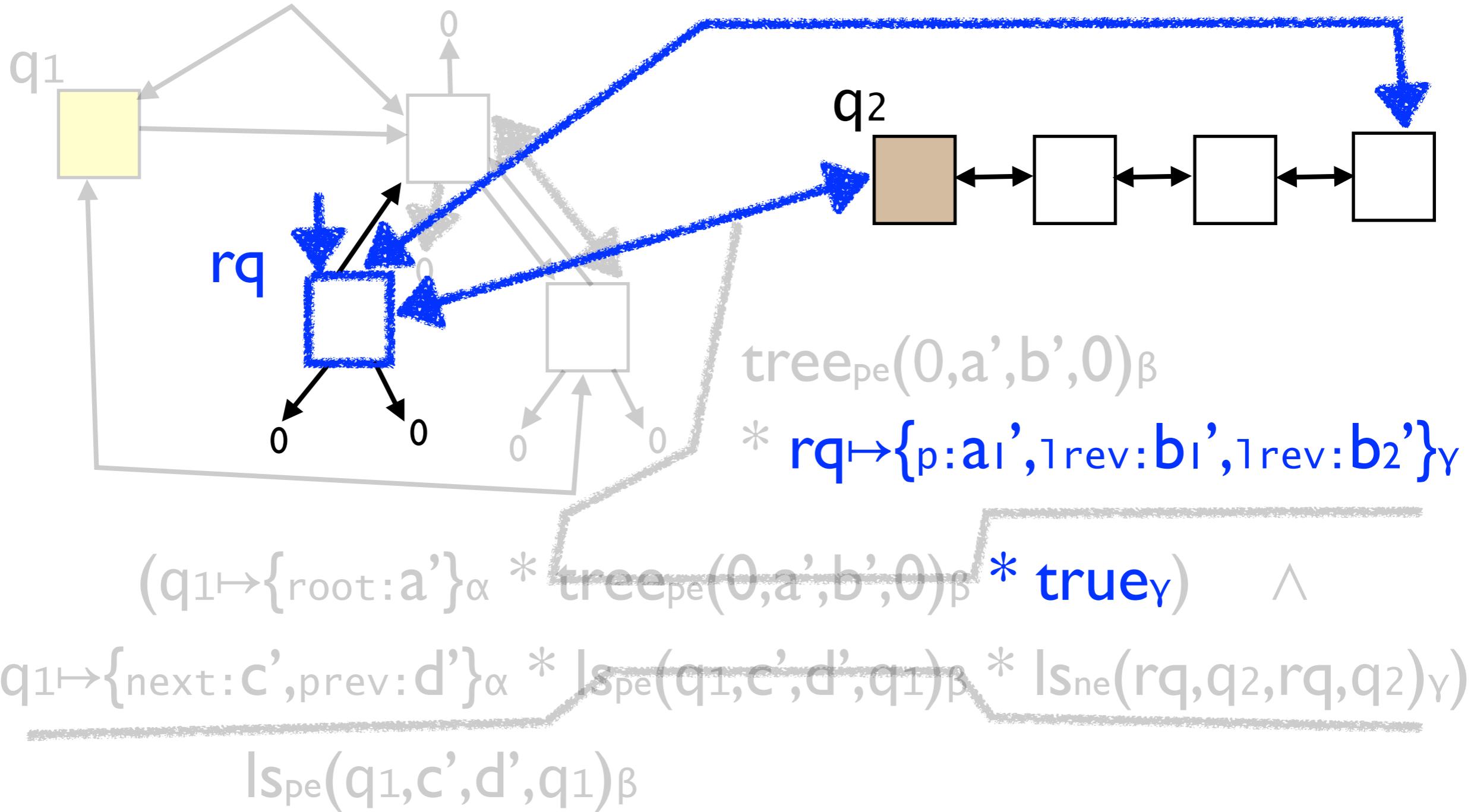
$ls_{pe}(q_1,c',d',q_1)_\beta$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ;

```

Merge  $\Upsilon, \delta$

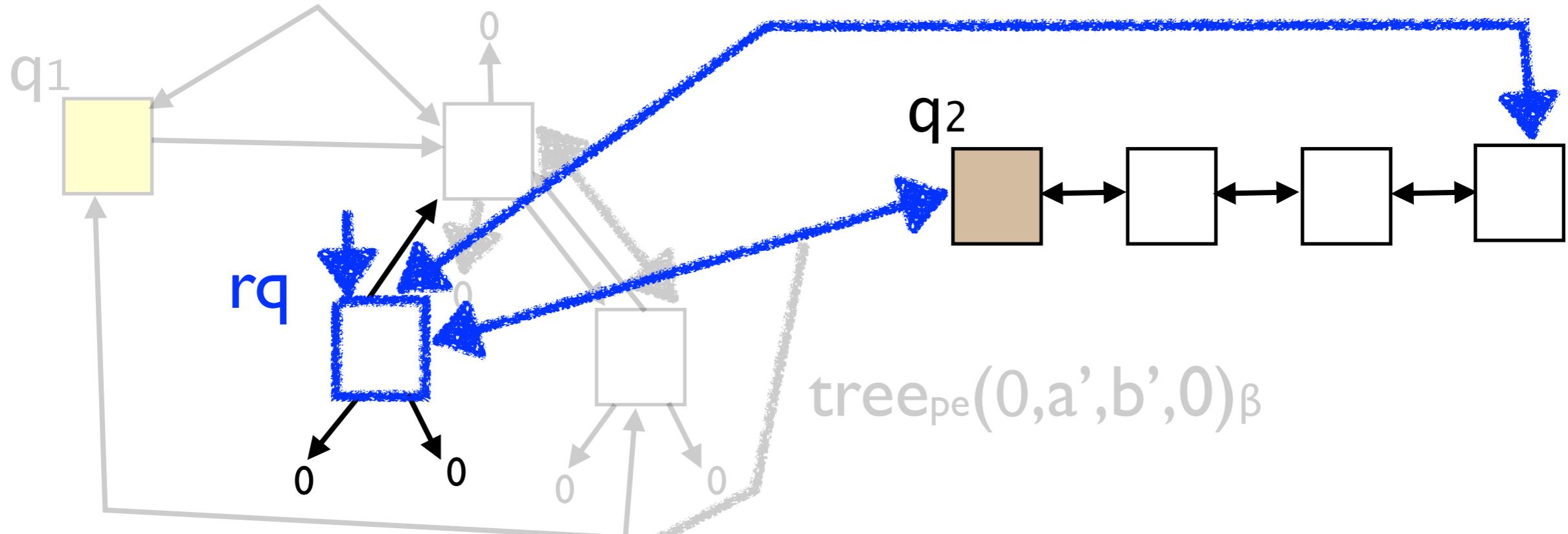


```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq);  $\gamma \leftarrow \gamma \cup \delta$ ;

```

Merge  $\gamma, \delta$

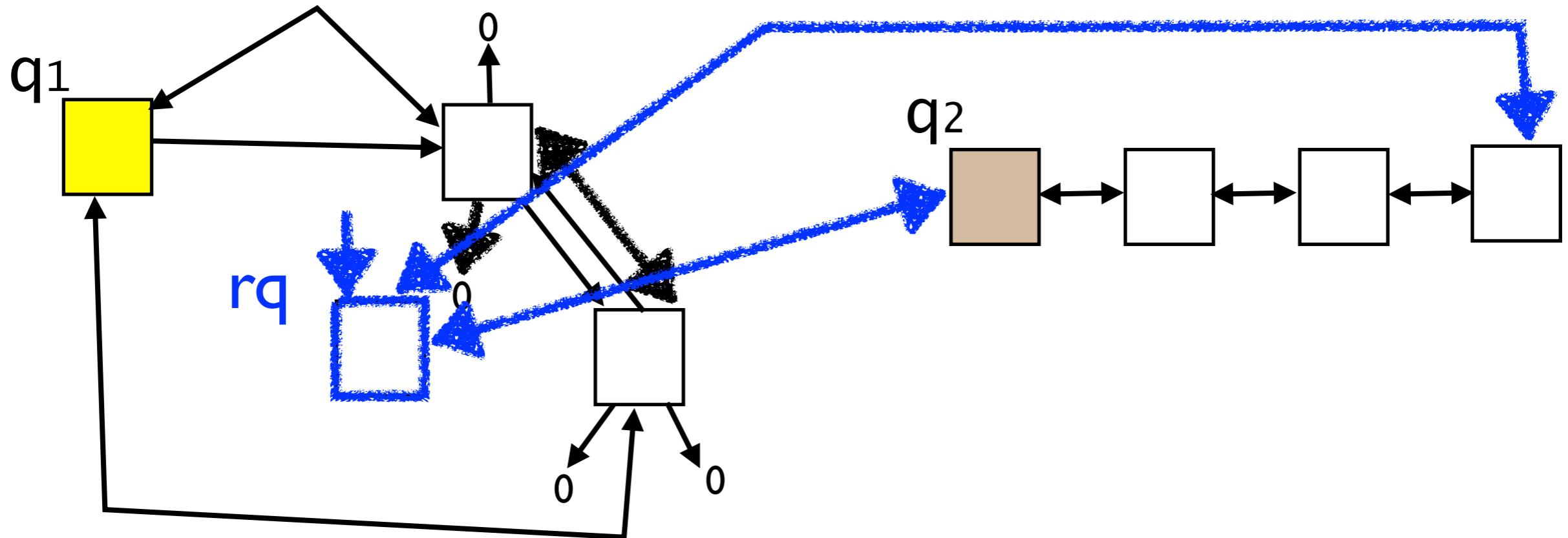


$(q_1 \mapsto \{\text{root}:a'\}_{\alpha} * \text{tree}_{\text{pe}}(0,a',b',0)_{\beta} * \text{true}_{\gamma}) \wedge$   
 $(q_1 \mapsto \{\text{next}:c', \text{prev}:d'\}_{\alpha} * \text{ls}_{\text{pe}}(q_1,c',d',q_1)_{\beta} * \text{ls}_{\text{ne}}(\text{rq},q_2,\text{rq},q_2)_{\gamma})$   
 $\text{ls}_{\text{pe}}(q_1,c',d',q_1)_{\beta}$

```

rq=find(q1,key);
list_del(q1,rq); moveInfo(2,1,rq);
tree_del(q1,rq); transfer(rq, δ);
list_insert(q2,rq); Y ← Y ∪ δ;

```



$$\begin{aligned}
& (q_1 \mapsto \{\text{root: } a'\}_\alpha * \text{tree}_{\text{pe}}(0, a', b', 0)_\beta * \text{true}_Y) \quad \wedge \\
& (q_1 \mapsto \{\text{next: } c', \text{prev: } d'\}_\alpha * \text{ls}_{\text{pe}}(q_1, c', d', q_1)_\beta * \text{ls}_{\text{ne}}(\text{rq}, q_2, \text{rq}, q_2)_Y)
\end{aligned}$$

# Abstract operators

$$\text{Dom} = \text{P(TreeForm)} \times \text{P(ListForm)} \cup \{\top\}$$

$$\text{Form} = \text{TreeForm} \cup \text{ListForm}$$

- $\text{moveInfo}(2, l, x) : \text{Dom} \rightarrow \text{Dom}$
- $\text{transfer}(x, \alpha) : \text{Form} \rightarrow \text{Form} \cup \{\top\}$
- $\alpha \leftarrow \beta \cup \alpha : \text{Form} \rightarrow \text{Form}$
- Also, other usual operators. Namely, abstraction function, join, and abstract transfer functions.

# moveInfo(2, l ,x)

- Transfers information about the cell  $x$  from the list part to the tree part.
- $\text{moveInfo}(x)( (\text{T}_1 \vee \text{T}_2) \wedge (\text{L}_1 \vee \text{L}_2) ) =$   
let  $A = \bigcup_i \text{collect}(x, L_i)$  in  $(\forall_i \text{case}(x, A, T_i)) \wedge (L_1 \vee L_2)$
- $\text{collect}(x, L_i)$  computes a set of partitions containing  $x$ :  
 $\text{collect}(x, L_i) = A_i \Rightarrow L_i \vdash (\text{alloc}(x) \wedge x \in \bigcup A_i)$
- $\text{case}(x, A, T_i)$  materialises cell  $x$  for  $T_i$ :  
 $\text{case}(x, A, T_i) = (\forall_j T'_j) \Rightarrow (T_i \wedge \text{alloc}(x) \wedge x \in A) \vdash \forall_j T'_j$

# transfer( $x, \alpha$ )

$\text{transfer}(x, \alpha) : \text{Form} \rightarrow \text{Form} \cup \{\top\}$

- Changes the partition tag of  $x$  to  $\alpha$ .
- $\text{transfer}(x, \alpha)(F) =$   
match  $F$  with
  - | ... \*  $x \mapsto \{..\}_\gamma \Rightarrow \dots * x \mapsto \{..\}_\alpha$
  - | \_  $\Rightarrow \top$
- Used to take  $x$  out of an existing partition.

$$\alpha \leftarrow \beta \cup \alpha$$

$$\alpha \leftarrow \beta \cup \alpha : \text{Form} \rightarrow \text{Form}$$

- $(\alpha \leftarrow \beta \cup \alpha)(F) = (F[\alpha / \beta])$
- Implements the merging of two partitions.
- Introduced on the fly during abstraction.

# Inserting moveInfo and transfer

Use forward and backward pre-analyses to find out places to insert moveInfo and transfer.

```
void move(key ,q1,q2) {  
    request* rq=find(q1,key);  
    list_del(q1,rq); moveInfo(2,1,rq);  
    tree_del(q1,rq); transfer(rq, $\delta$ );  
    list_insert(q2,rq);  $\Upsilon \leftarrow \Upsilon \cup \delta$ ; }  
}
```

# Inserting moveInfo and transfer

Use forward and backward pre-analyses to find out places to insert moveInfo and transfer.

```
void move(key, q1, q2) {  
    request* rq=find(q1, key);  
    list_del(q1, rq); moveInfo(2, 1, rq);  
    tree_del(q1, rq); transfer(rq, δ);  
    list_insert(q2, rq); Y←Y ∪ δ; }  
    
```

Both tree and list parts contain  $\text{rq} \mapsto \{\dots\}$ .

# Inserting moveInfo and transfer

Use forward and backward pre-analyses to find out places to insert moveInfo and transfer.

Only the list part contains info on rq, but the tree part needs info on rq.

```
request* rq=find(q1, key);  
list_del(q1, rq); moveInfo(2, 1, rq);  
tree_del(q1, rq); transfer(rq, δ);  
list_insert(q2, rq); Y←Y ∪ δ; }
```

Both tree and list parts contain  $\text{rq} \mapsto \{\dots\}$ .

# Take-home message I

- Components of overlaid data structures are loosely correlated.
- Can exploit this loose correlation by running multiple independent analyses with minimal communication among them.
- We realised the minimal communication using  $*$ ,  $\wedge$  and  $\alpha$ .

# Take-home message 2

- How to make two expensive analyses talk a little bit, without compromising performance too much?
- Think about using ghost variables and designing an algorithm for discovering necessary ghost commands.