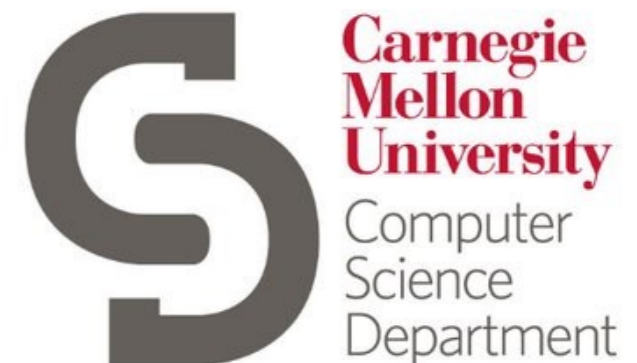


Work Analysis with Resource-Aware Session Types

Ankush Das
Jan Hoffmann
Frank Pfenning

LICS, July 10, 2018

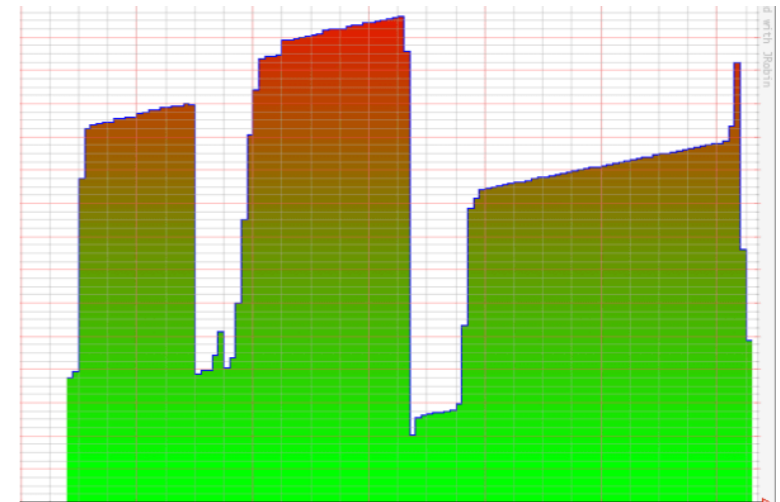


Goal for this Talk

Resource Analysis for Concurrent Programs



Execution Time



Memory Usage

Why Resource Analysis?

Why Resource Analysis?



Complexity of Parallel Algorithms

Çiçek et. al. (ESOP '15)

Why Resource Analysis?



Complexity of Parallel Algorithms

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Design of Optimal Scheduling Policies

Acar et. al. (JFP '16)

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Prevention of Side-Channel Attacks

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Static and Dynamic Profiling

Haemmerlé et. al. (FLOPS '17)

Measures of Execution Time

Measures of Execution Time



Work

Sequential Complexity

**Execution time
on one processor**

Measures of Execution Time



Work
Sequential Complexity

**Execution time
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Span
Parallel Complexity

**Execution time on
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Measures of Execution Time

Today's
talk!



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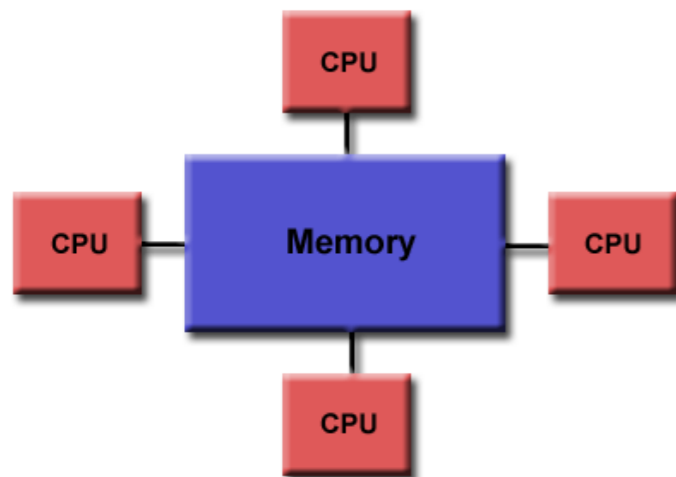


ICFP
2018

Span
Parallel Complexity
**Execution time on
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**Concurrent Programs
are hard to analyze!**

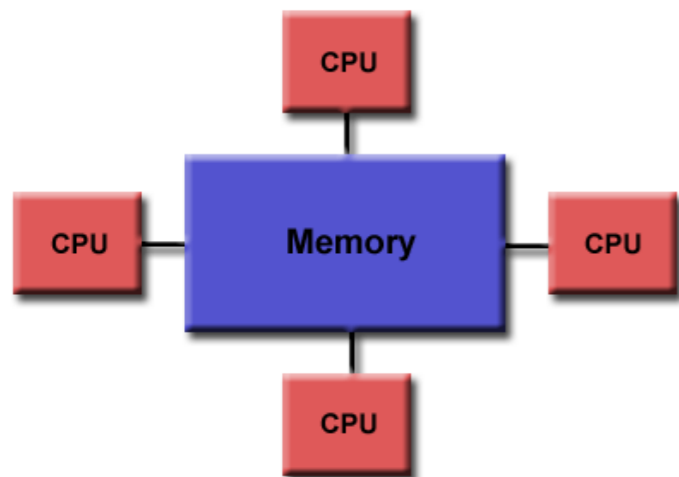
Concurrent Programs are hard to analyze!



Shared Memory

Read/Write Overhead

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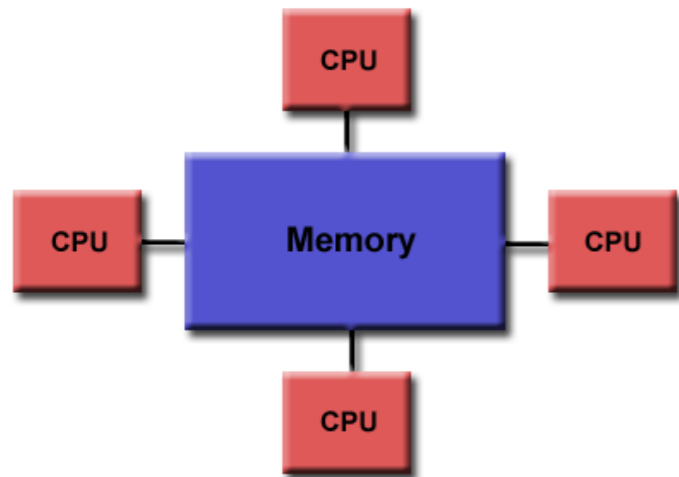
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Read/Write Overhead



Communication Overhead

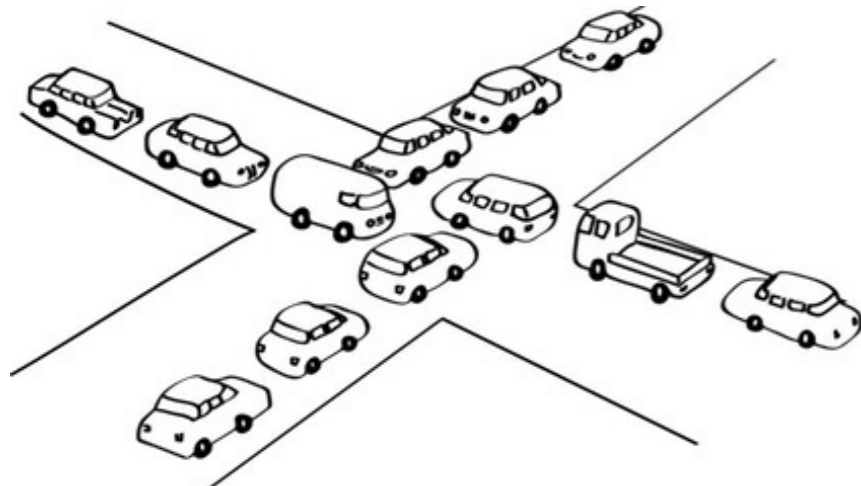
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**Shared Memory
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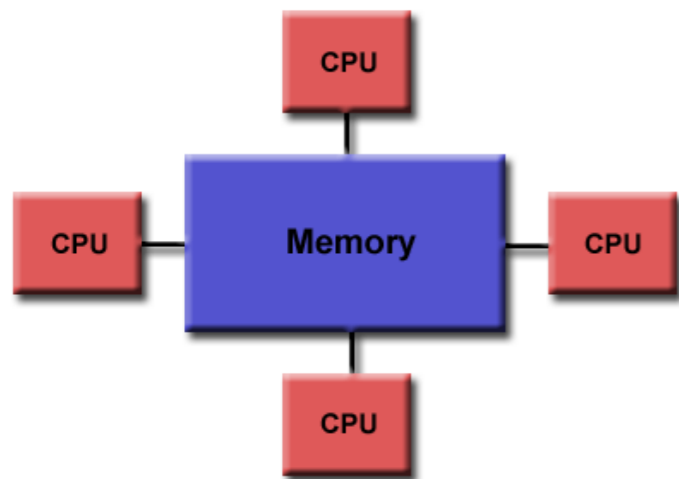


Communication Overhead

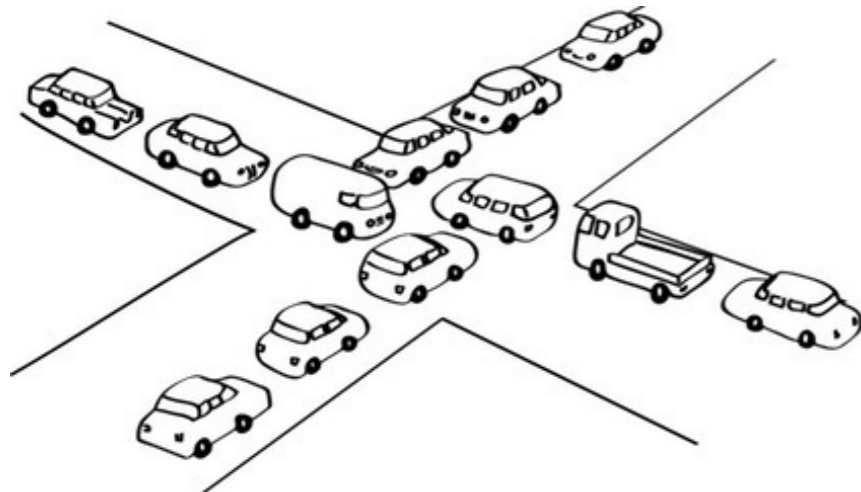


Deadlocks

Concurrent Programs are hard to analyze!



**Shared Memory
Read/Write Overhead**



Deadlocks

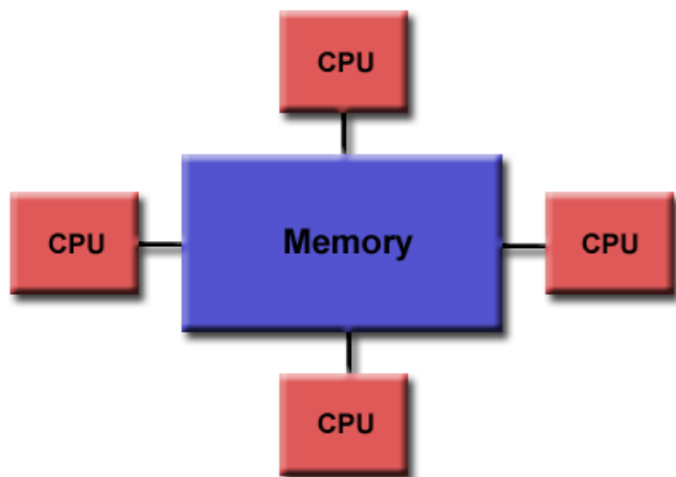


Communication Overhead



Non-Compositional

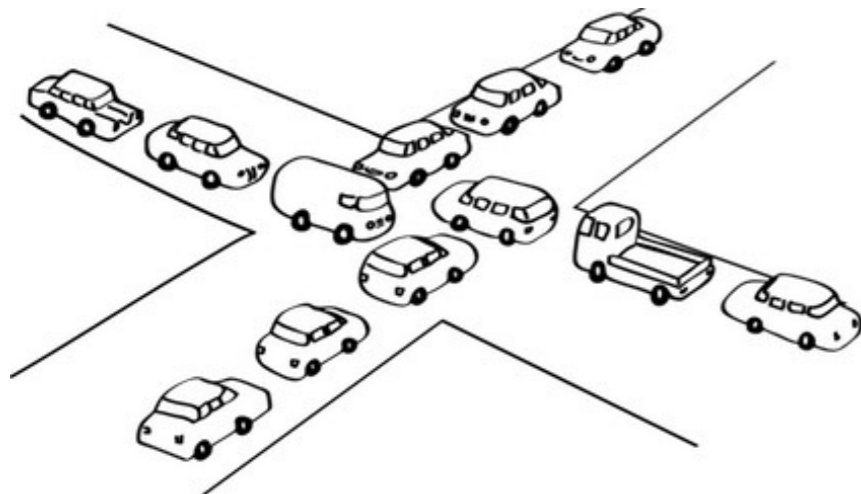
Session types can help :-)



**Shared Memory
Read/Write Overhead**



Communication Overhead

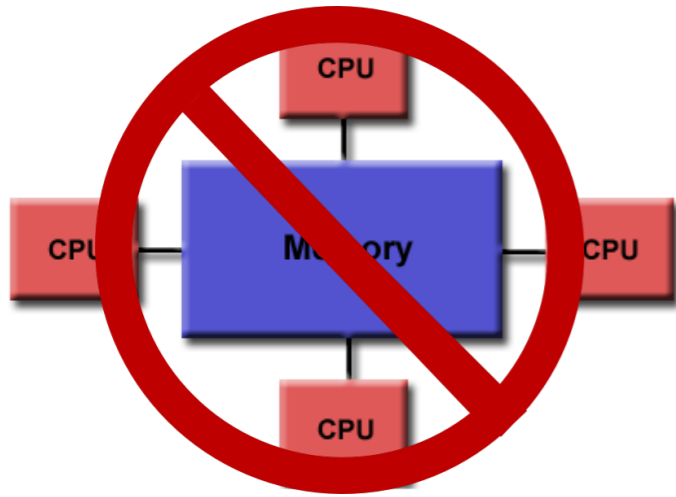


Deadlocks



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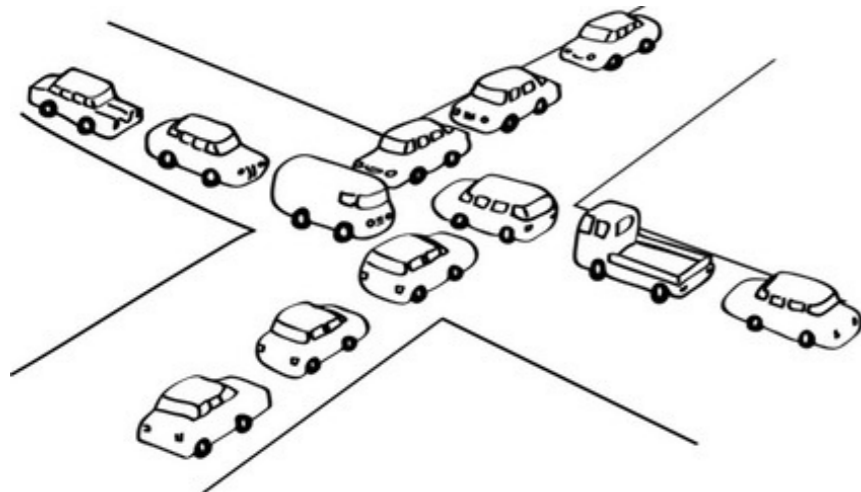
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No Shared Memory



Communication Overhead

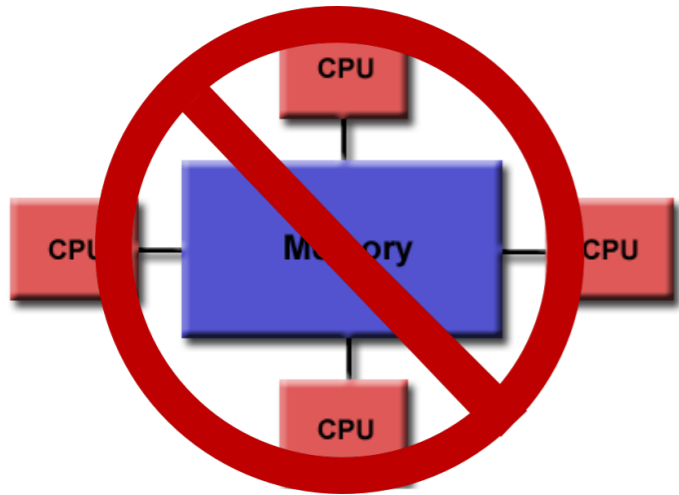


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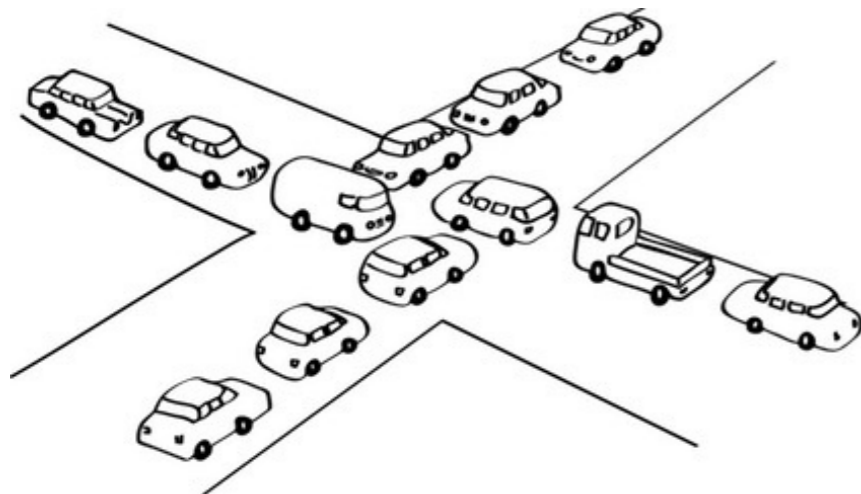


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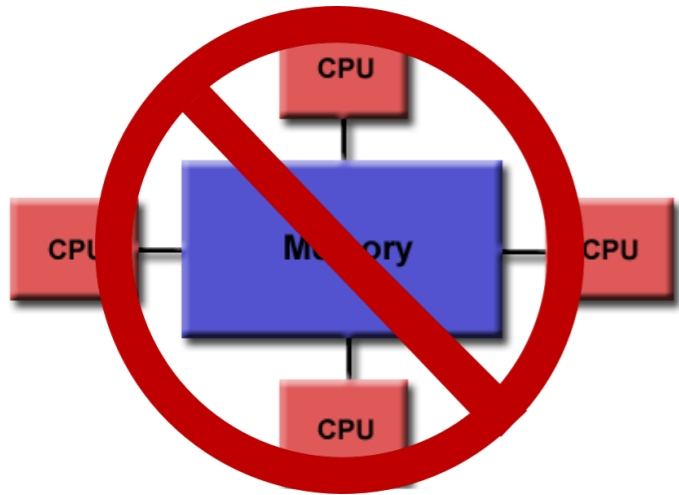


**Types strictly enforce
communication protocols**



Non-Compositional

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No Shared Memory



Deadlock Freedom

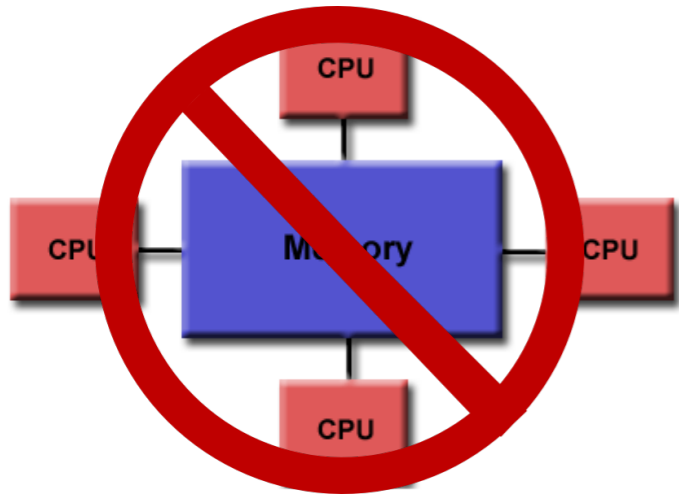


**Types strictly enforce
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Non-Compositional

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Deadlock Freedom



**Types strictly enforce
communication protocols**



**Channels abstract over
connected processes**

What are Session Types?

- **Implement message-passing concurrent programs**
- **Communication via bi-directional typed channels**
- **Curry-Howard isomorphism with intuitionistic linear logic**

What are Session Types?

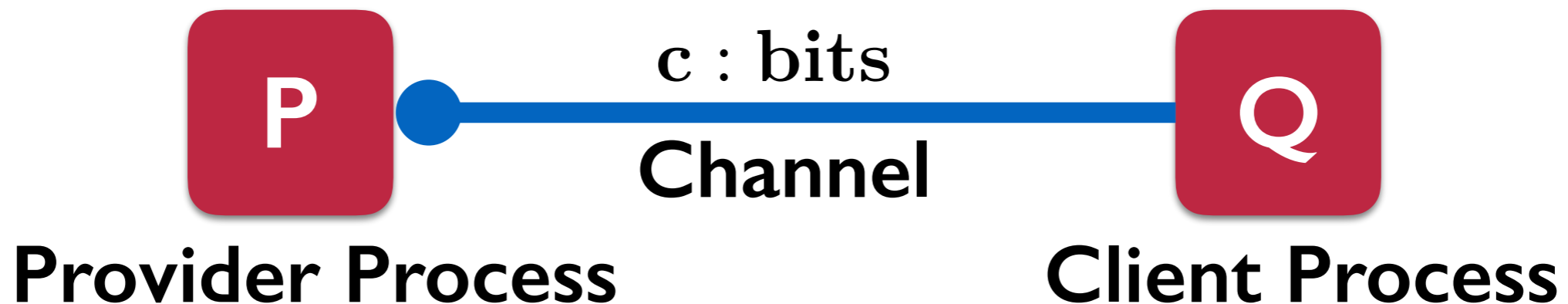
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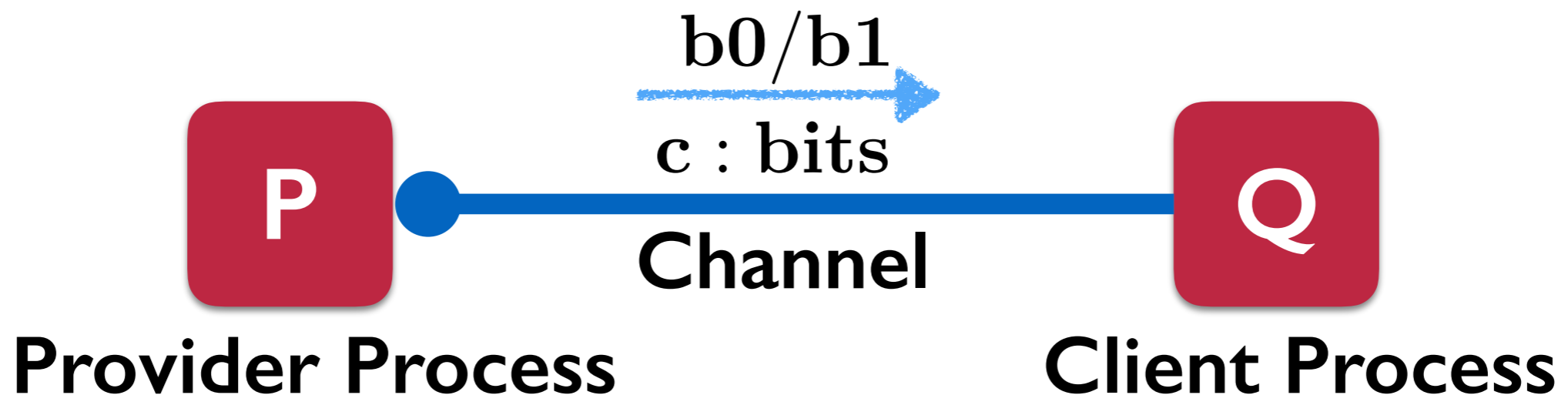
$$\text{bits} = \oplus \{b0 : \text{bits}, b1 : \text{bits}\}$$



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Contributions

Contributions

**Design a type system to analyze work
of session-typed programs**

Contributions

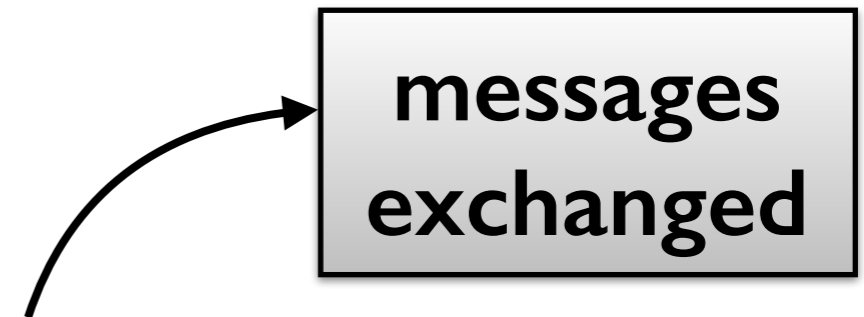
Design a type system to analyze work of session-typed programs

- based on **amortized analysis**
- can be **parameterized** to count different resources
- proved **sound** w.r.t. **cost semantics**
- **conservative** extension to standard session type system
- applied to all **standard** programs

Contributions

Design a type system to analyze work of session-typed programs

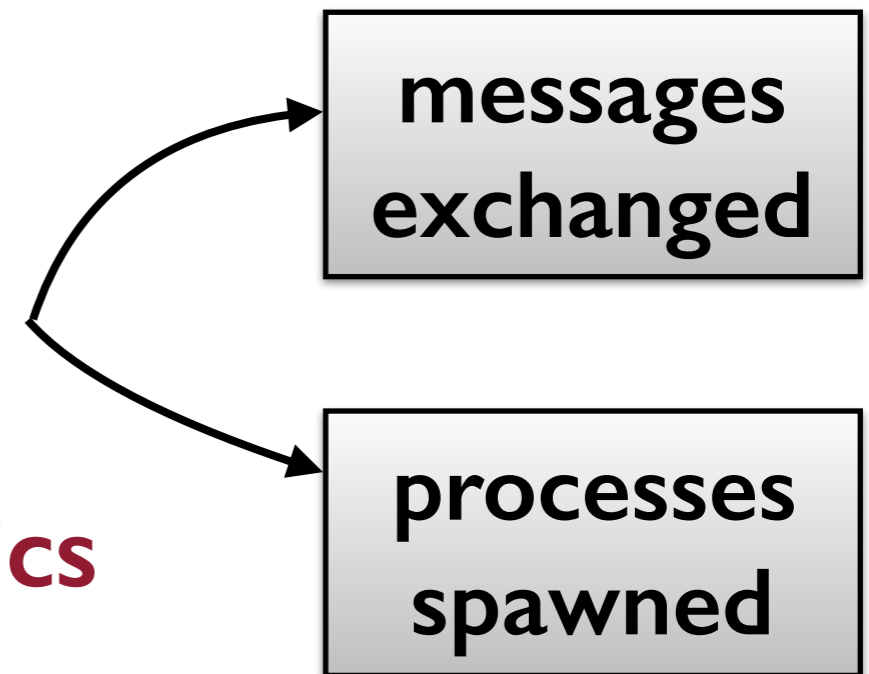
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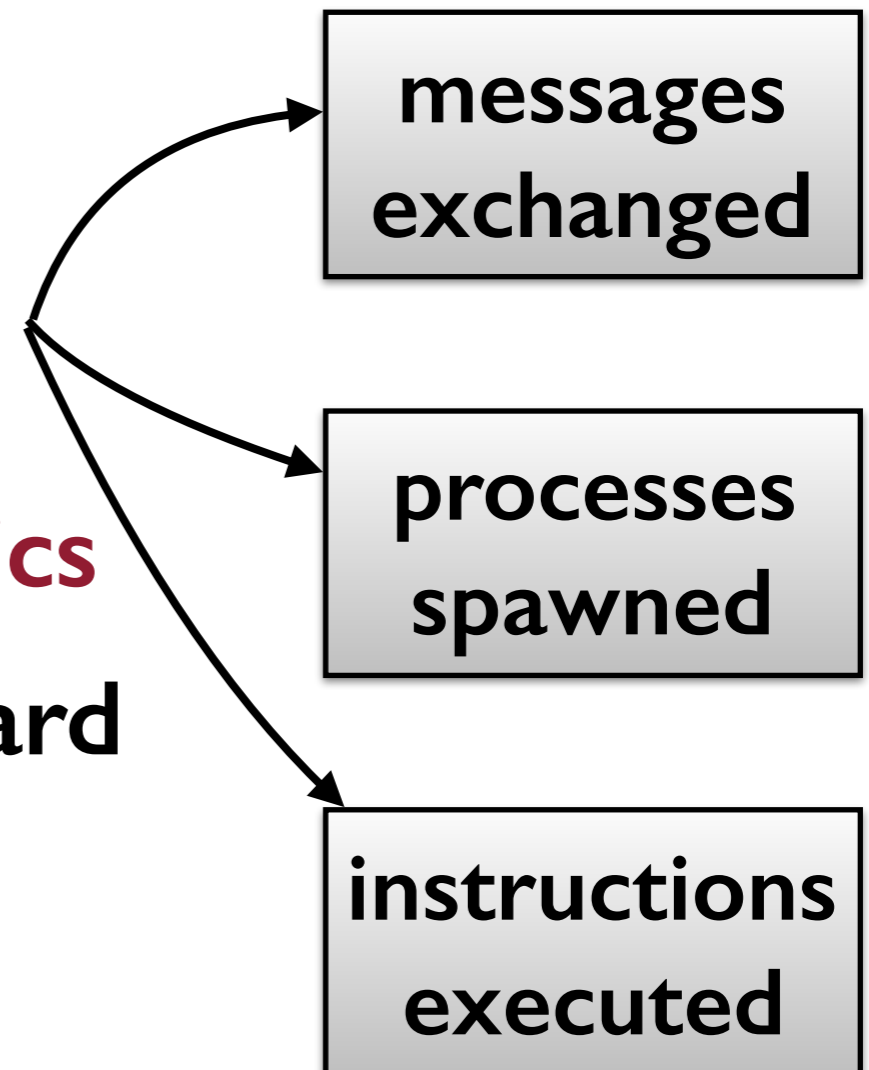
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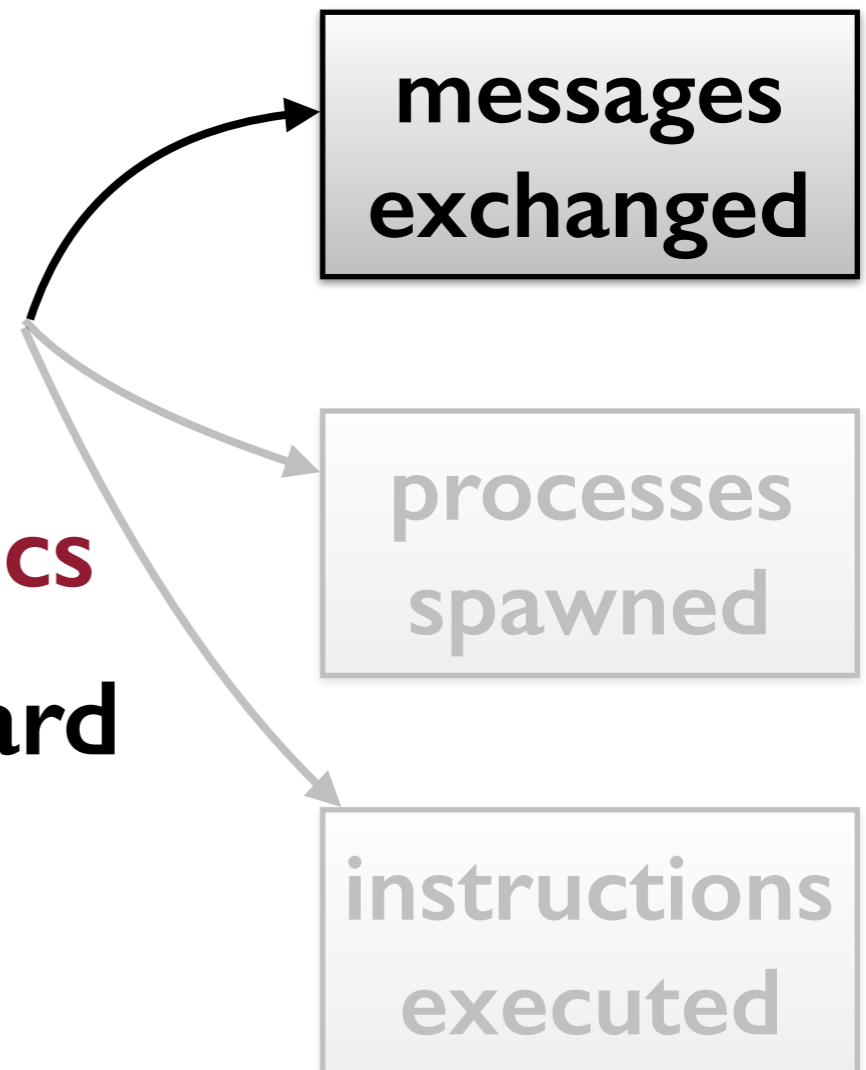
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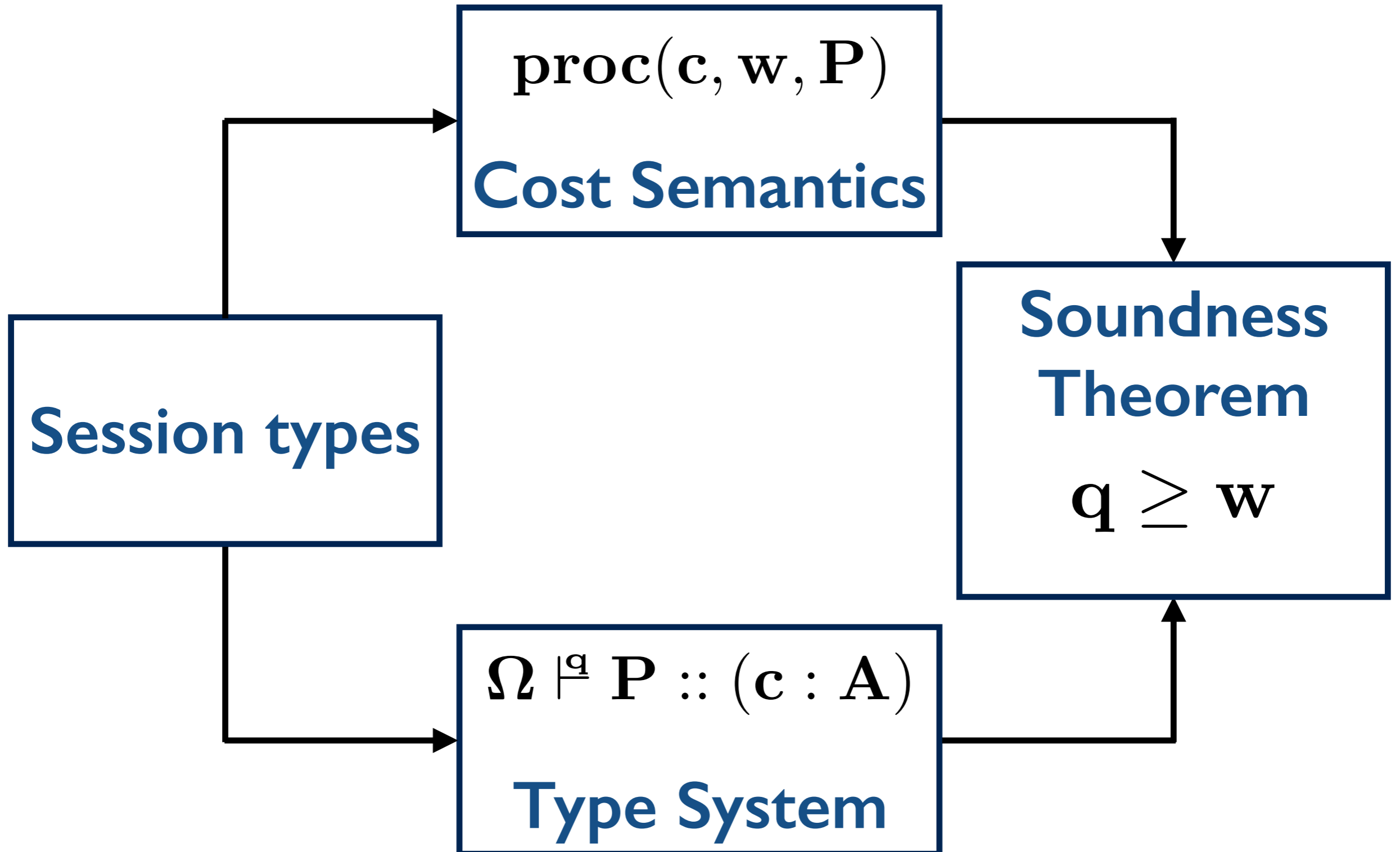
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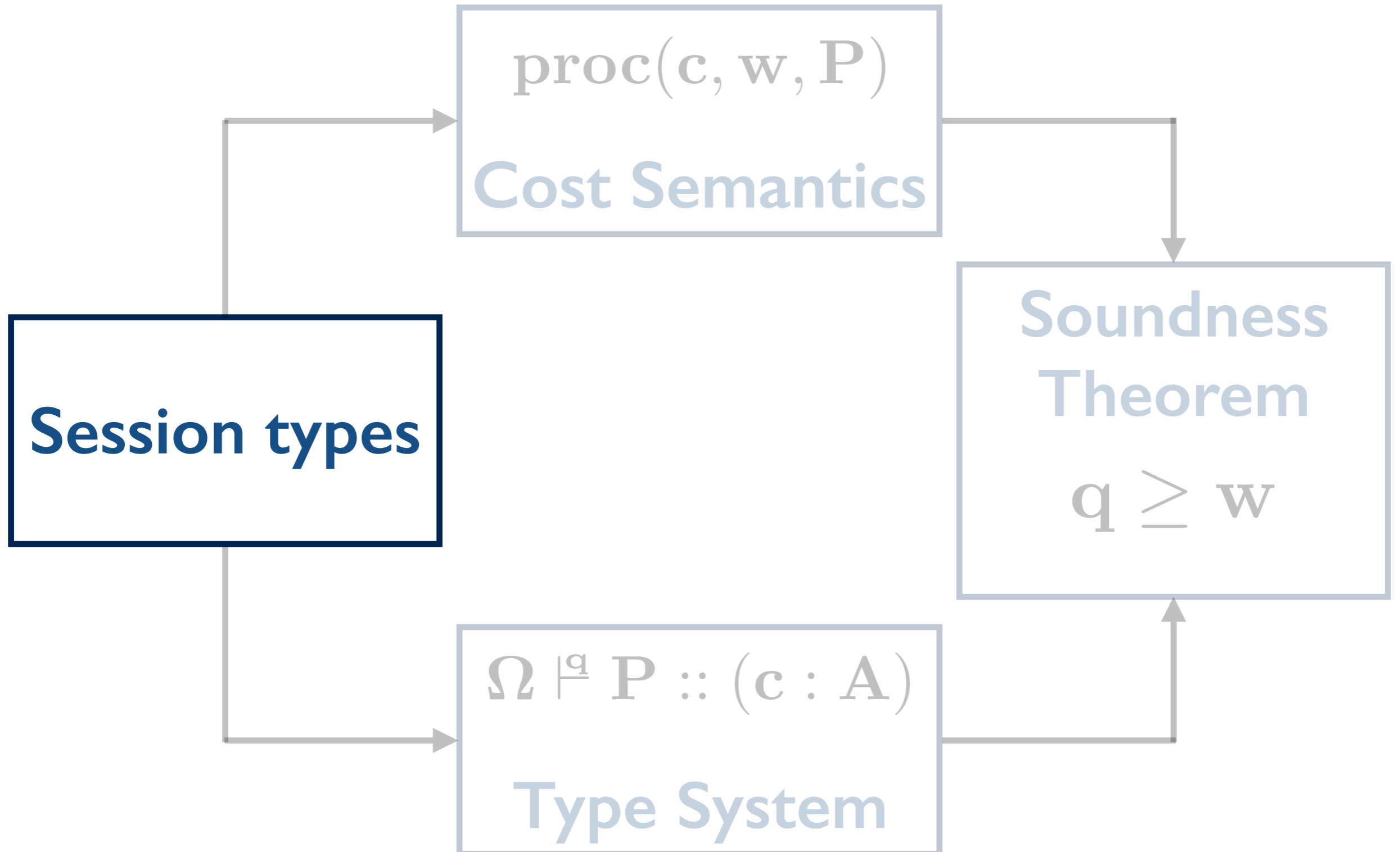
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Overview



Overview



Example: Queues



$$\begin{aligned} \text{queue}_{\mathbf{A}} = & \&\{\text{ins} : \mathbf{A} \multimap \text{queue}_{\mathbf{A}}, \\ & \text{del} : \oplus\{\text{none} : \mathbf{1}, \\ & \text{some} : \mathbf{A} \otimes \text{queue}_{\mathbf{A}}\}\} \end{aligned}$$

Example: Queues



offers choice
of ins/del

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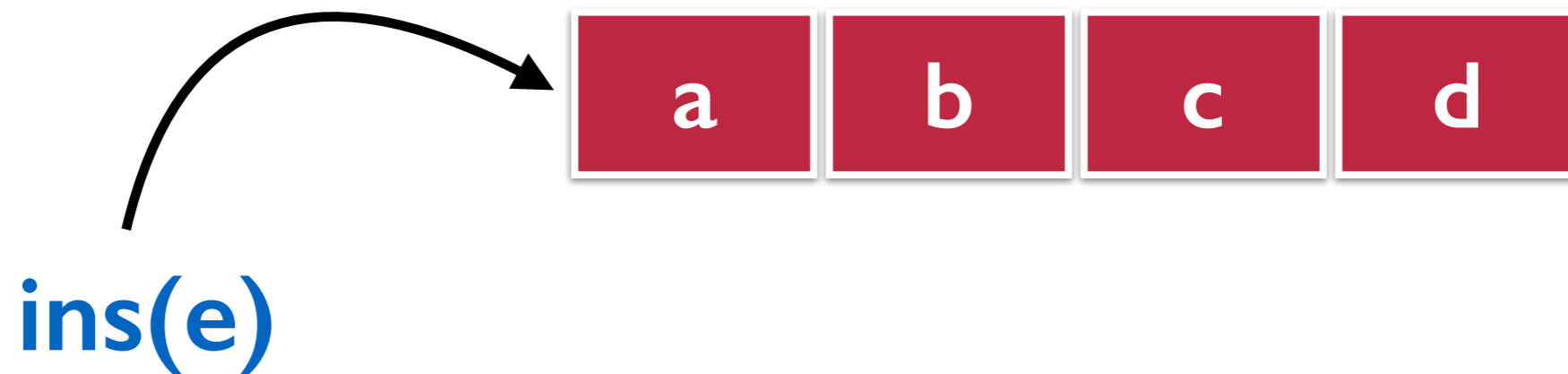
recv element
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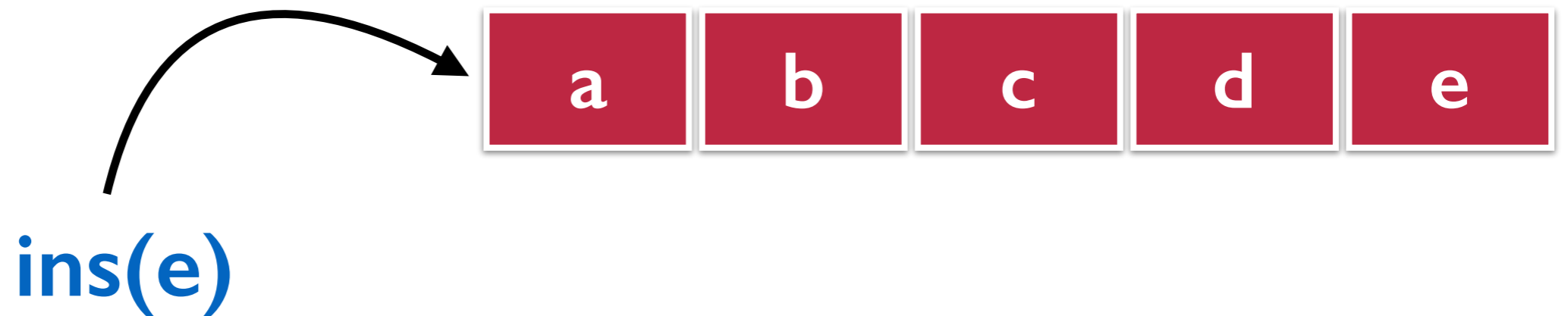
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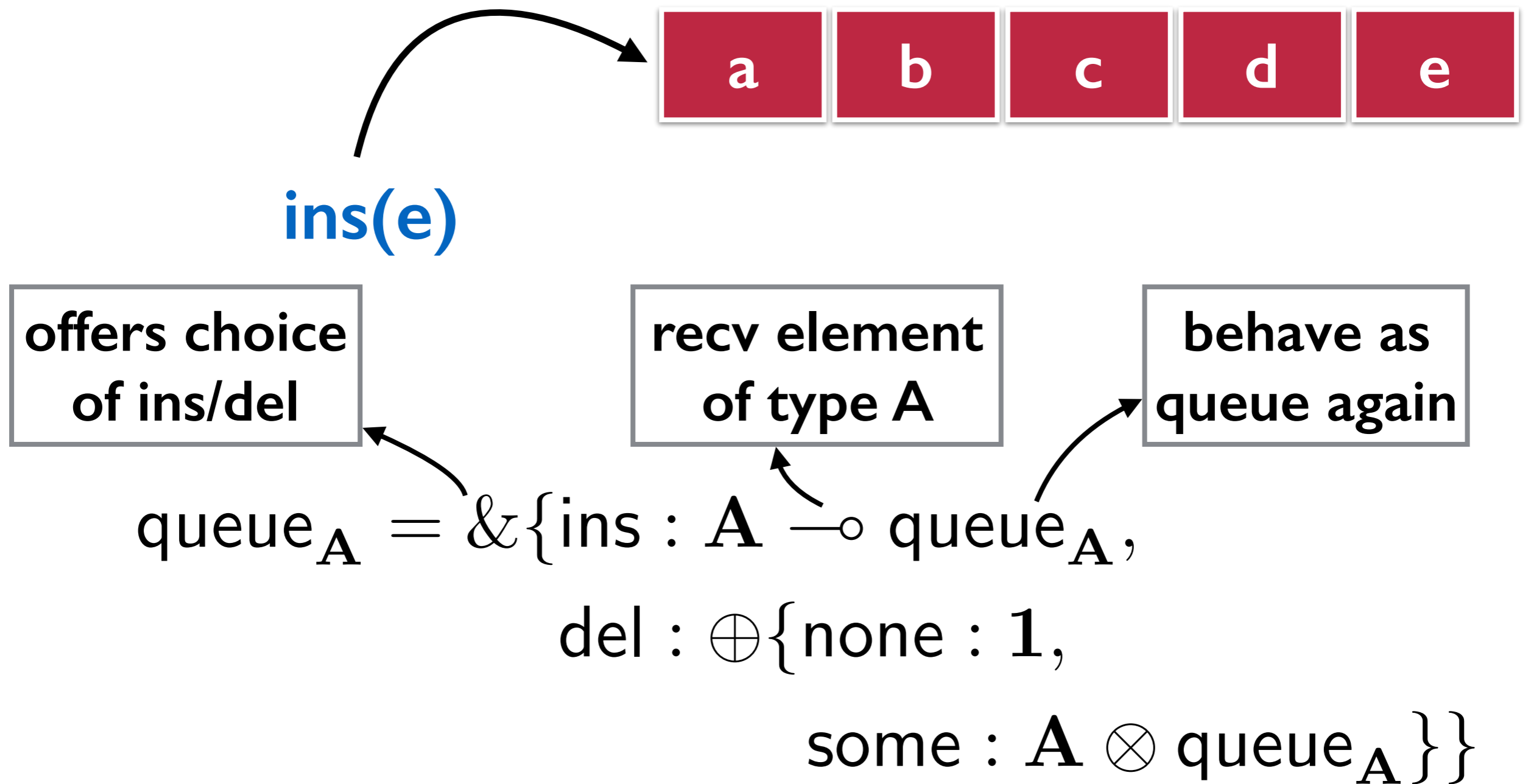
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send none if
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$\text{some} : A \otimes \text{queue}_A\}\}$

Example: Queues



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terminate

send none if
queue is empty

Example: Queues



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otherwise

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Example: Queues



offers choice
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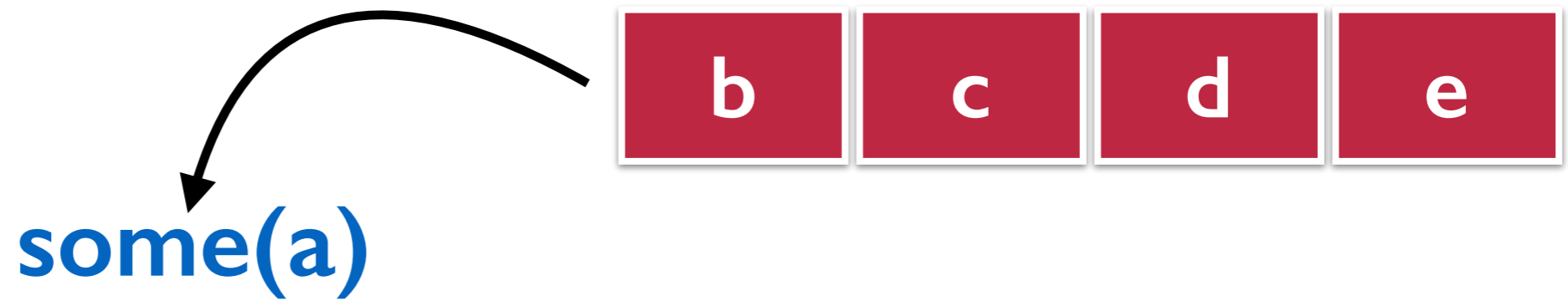
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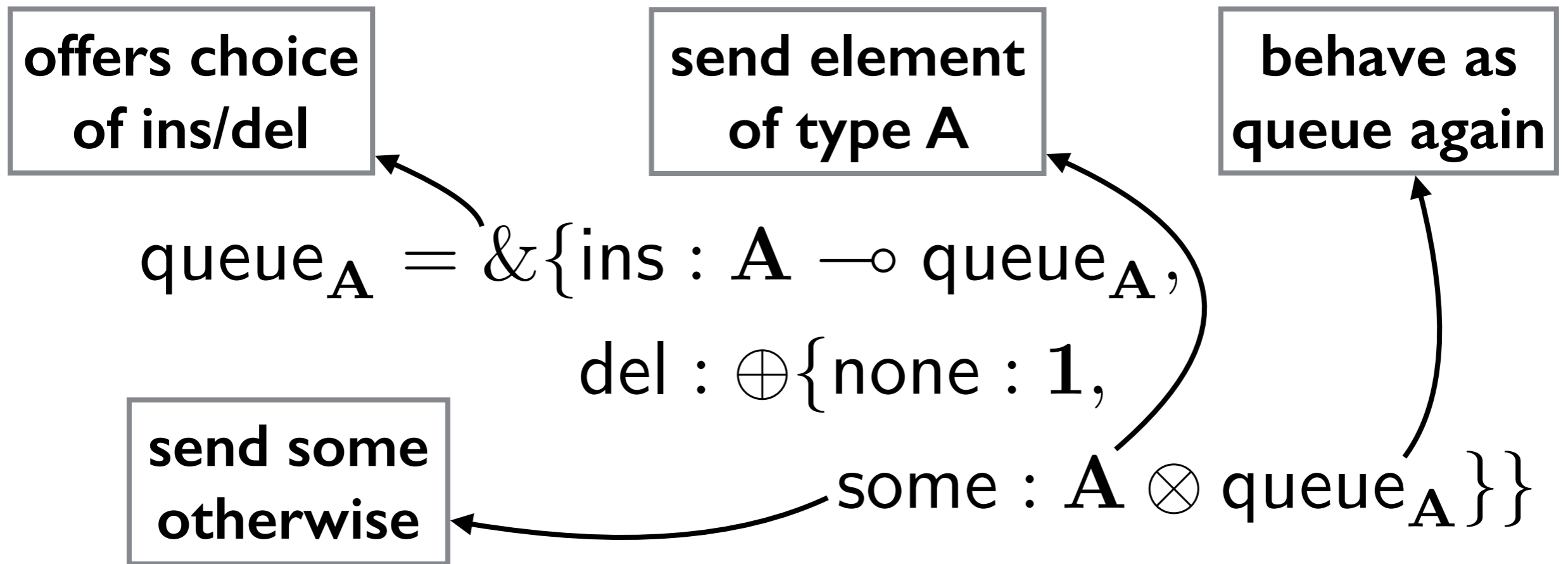
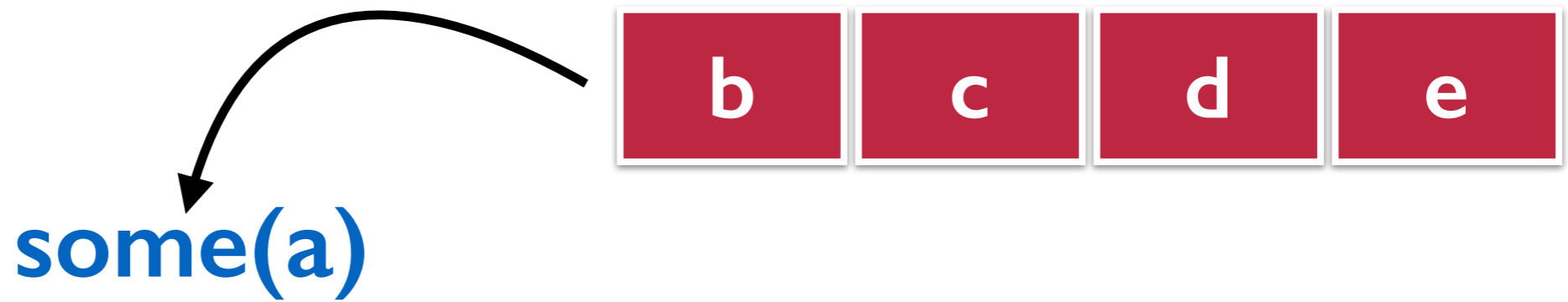
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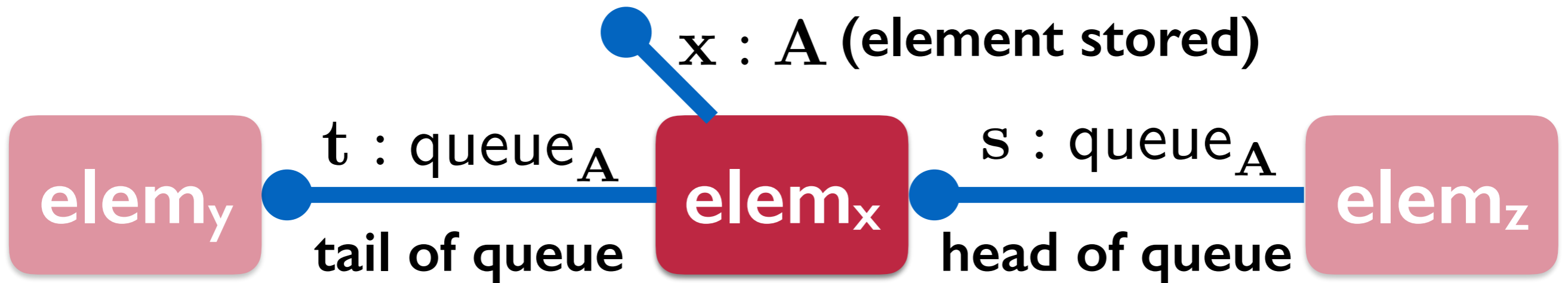
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send some
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Example: Queues

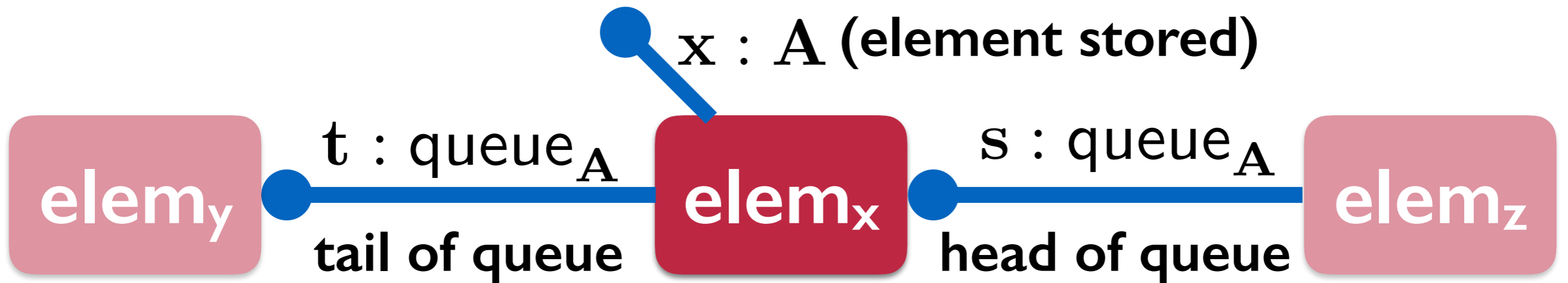


Session-typed Program



```
 $(x : A) (t : queue_A) \vdash elem :: (s : queue_A)$   
 $s \leftarrow elem \leftarrow x \ t =$   
  case  $s$  (ins  $\Rightarrow y \leftarrow recv \ s ;$   
           $t.ins ;$   
          send  $t \ y ;$   
           $s \leftarrow elem \leftarrow x \ t$   
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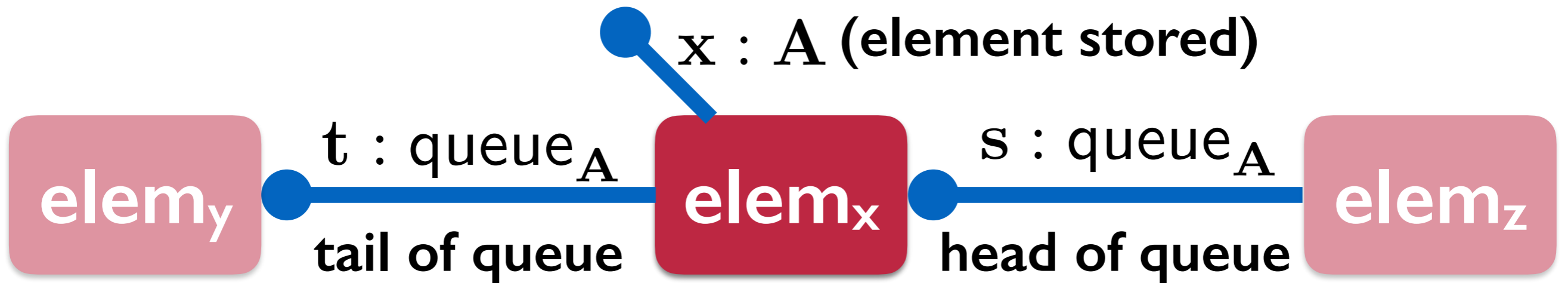
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```

recv 'ins' and y

Session-typed Program

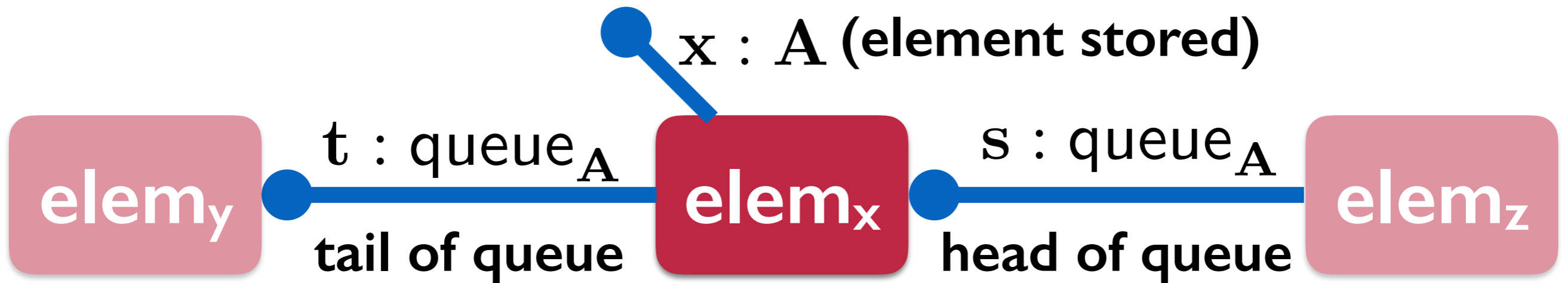


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recv 'ins' and y

send 'ins' and y

Session-typed Program



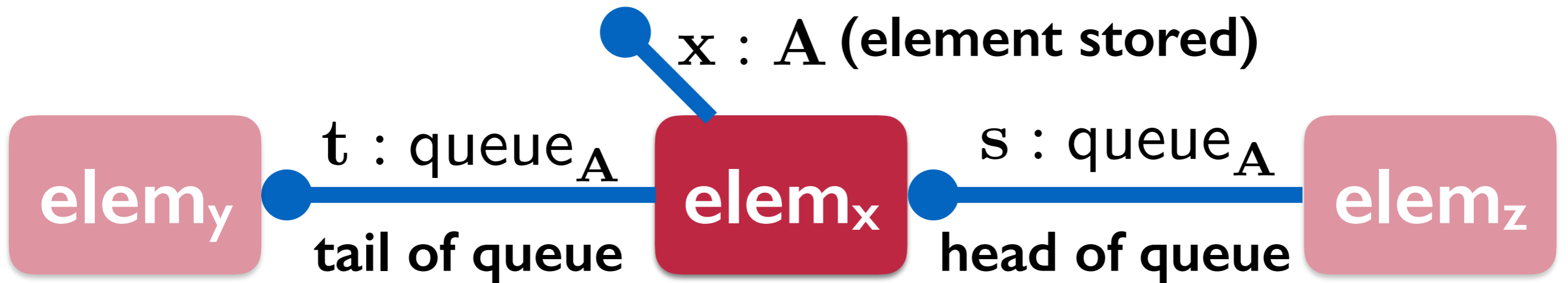
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recv 'ins' and y

send 'ins' and y

recurse

Session-typed Program



$(x : A) (t : \text{queue}_A) \vdash \text{elem} :: (s : \text{queue}_A)$

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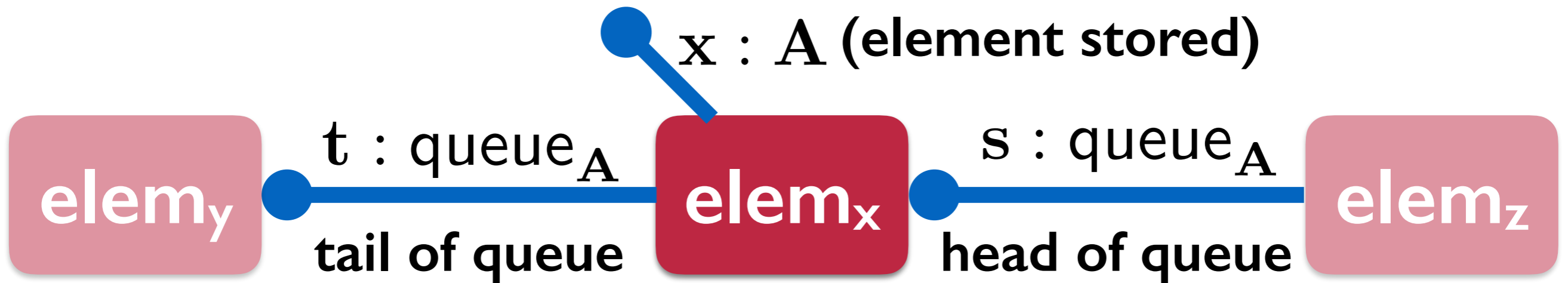
recv 'ins' and y

send 'ins' and y

recurse

send 'some', x

Session-typed Program



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recv 'ins' and y

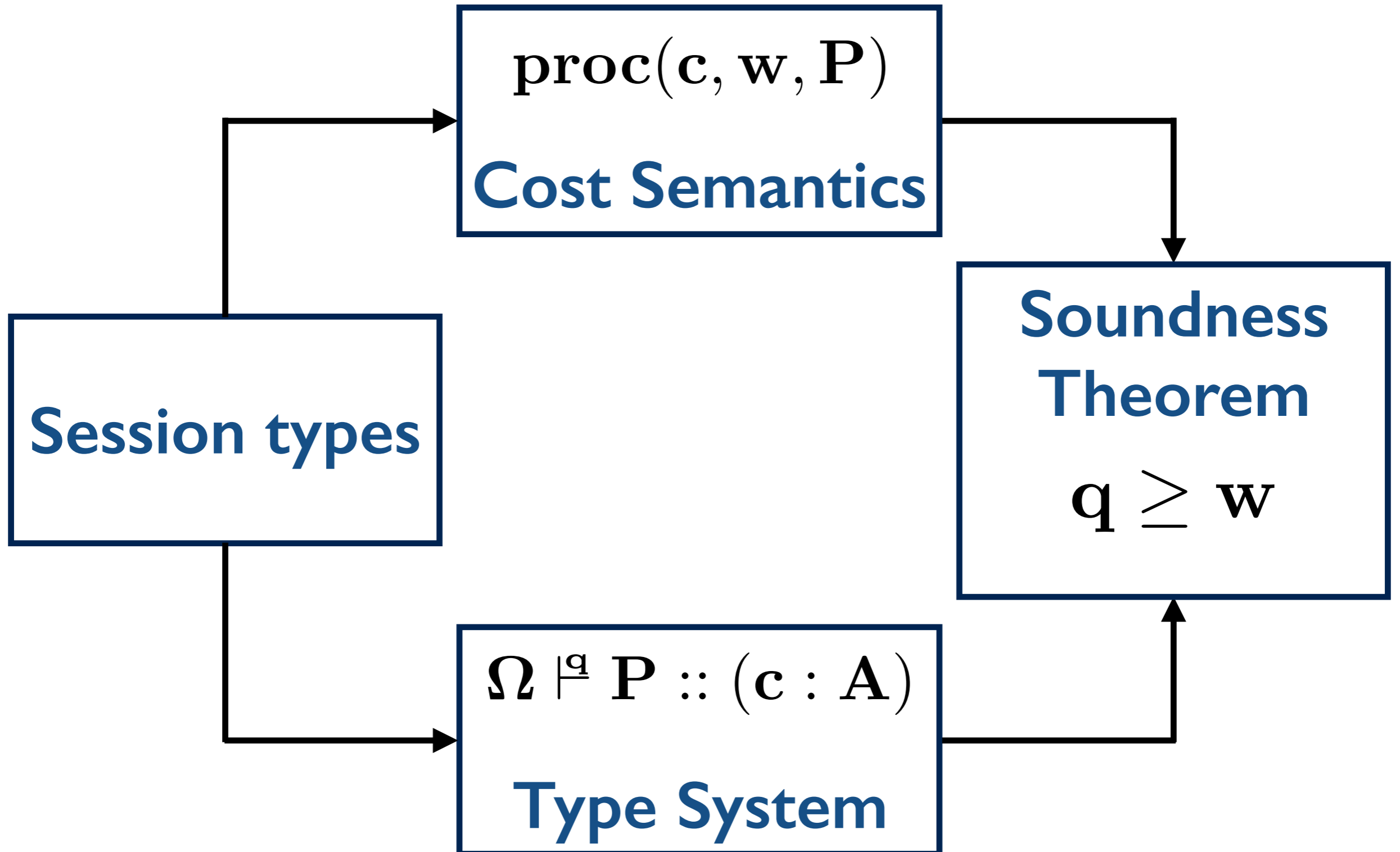
send 'ins' and y

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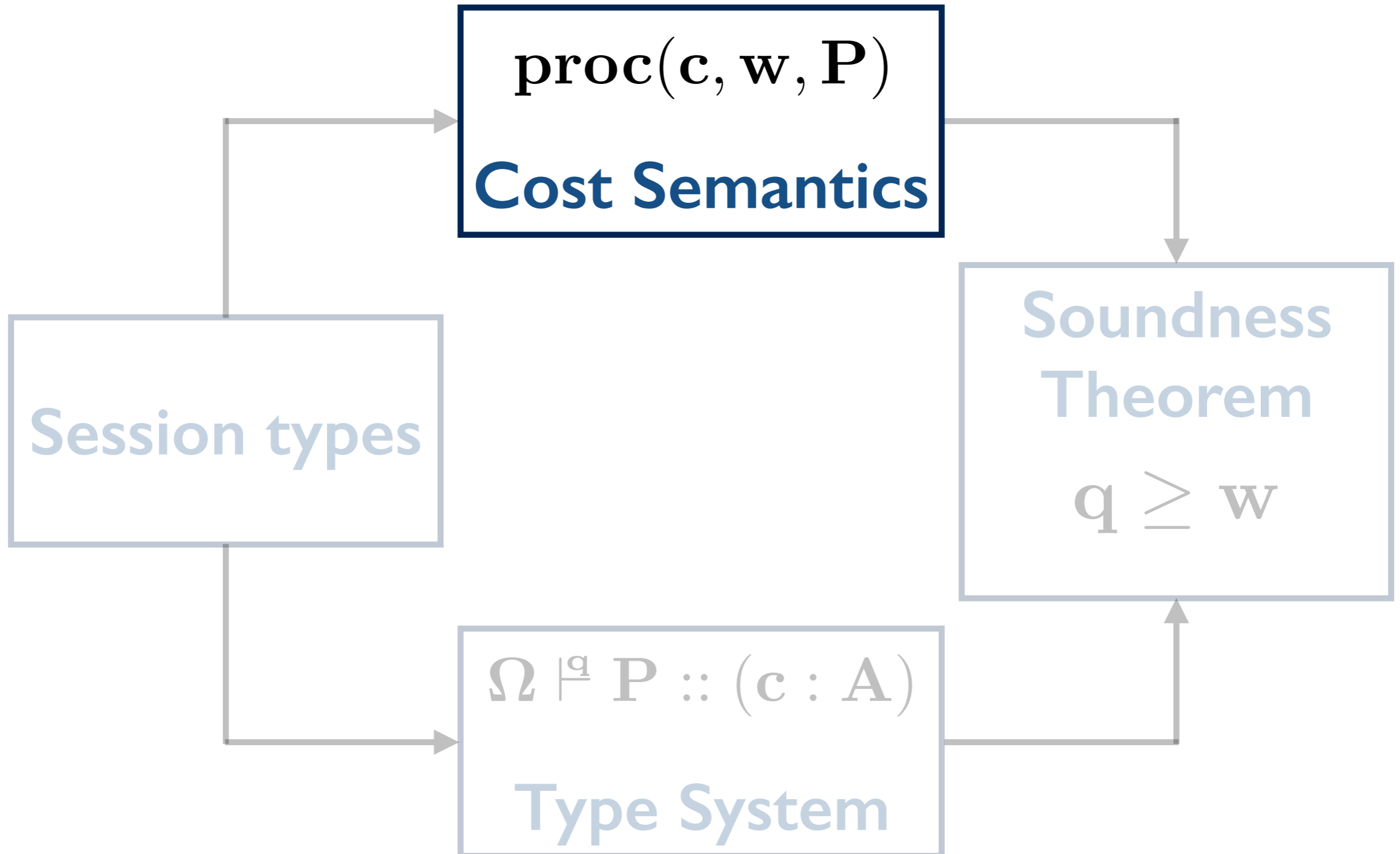
send 'some', x

terminate

Overview



Overview



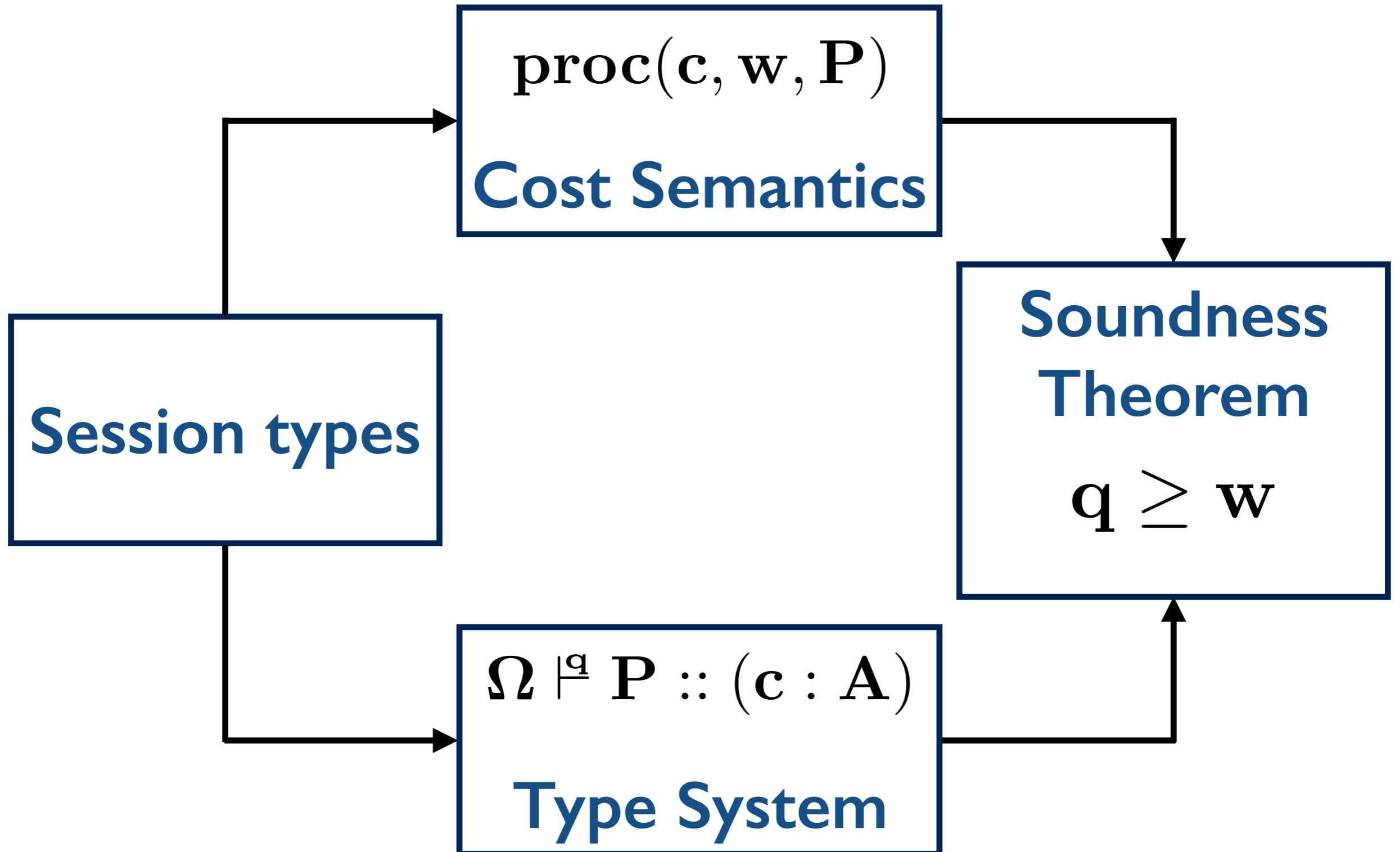
Cost Semantics

$\text{proc}(c, w, P)$

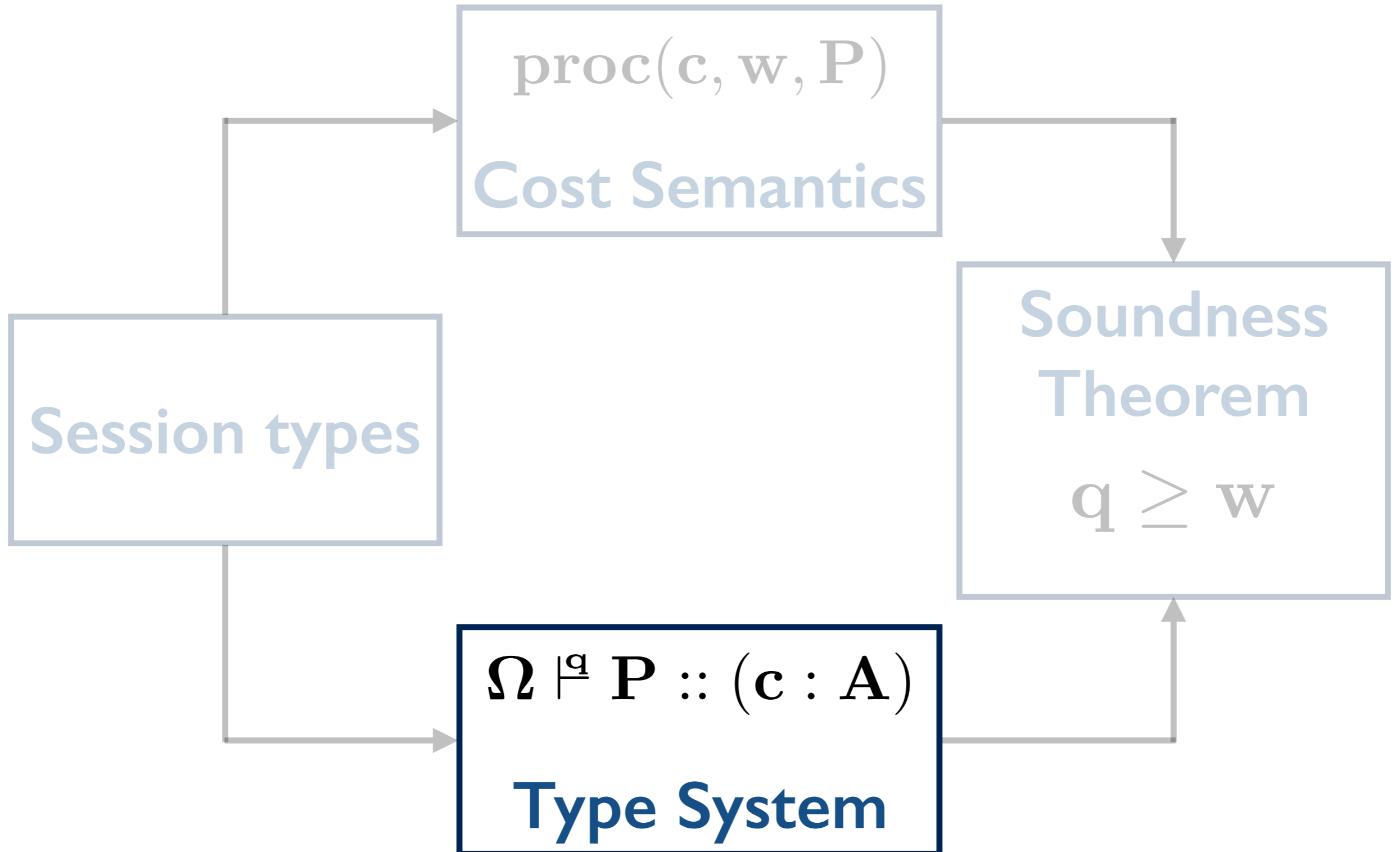
**Process P offering along channel c
and has performed work w**

- **Standard semantics extended with local work counters w for each process**
- **Total work of system is sum of local counters w**
- **w is incremented every time process P performs some ‘work’ (this talk: whenever message is sent)**

Overview



Overview



Type System

Based on Amortized Analysis!

- **Store potential in each process**
- **Potential can be transferred via messages**
- **Potential is consumed to perform ‘work’**

Type System

Based on Amortized Analysis!

- Store potential in each process
- Potential can be transferred via messages
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$$\Omega \vdash^q P :: (\mathbf{c} : \mathbf{A})$$

Process P offers along channel c ,
acts as a client for channels in Ω
and storing potential q

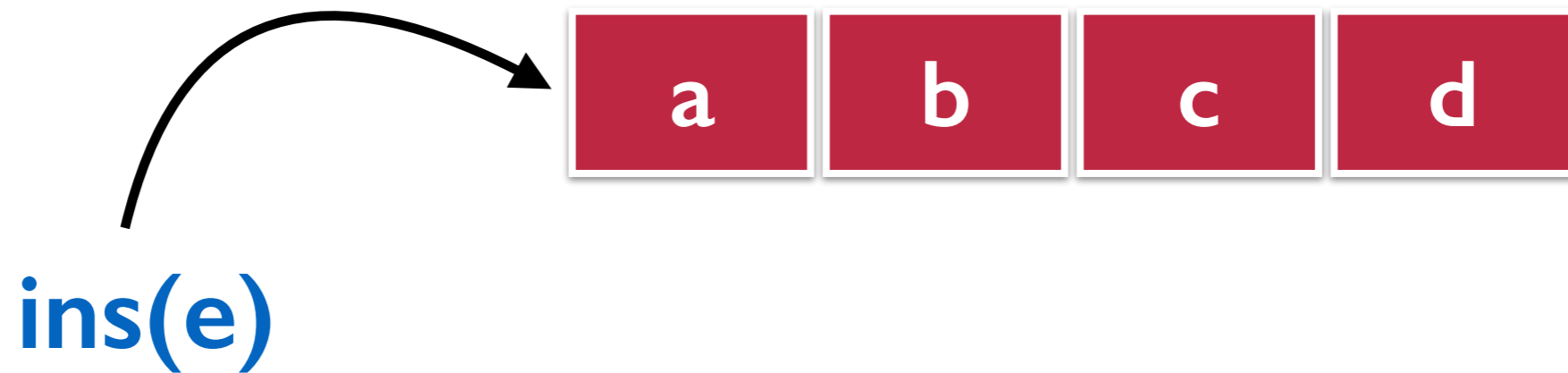
Concurrent Queues

Count the messages!



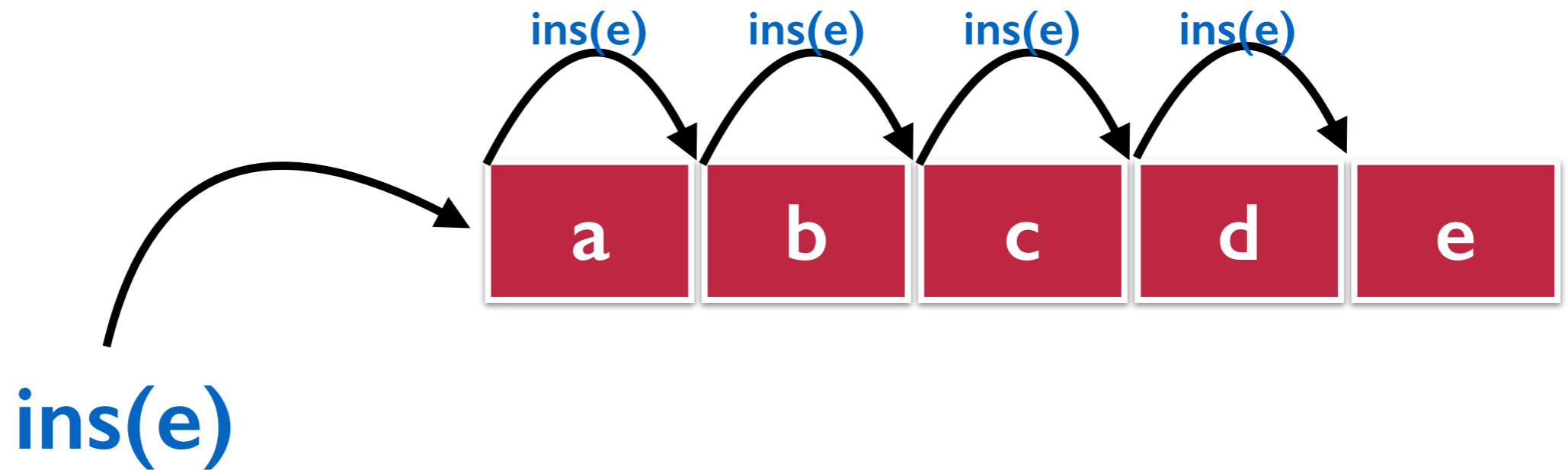
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Concurrent Queues

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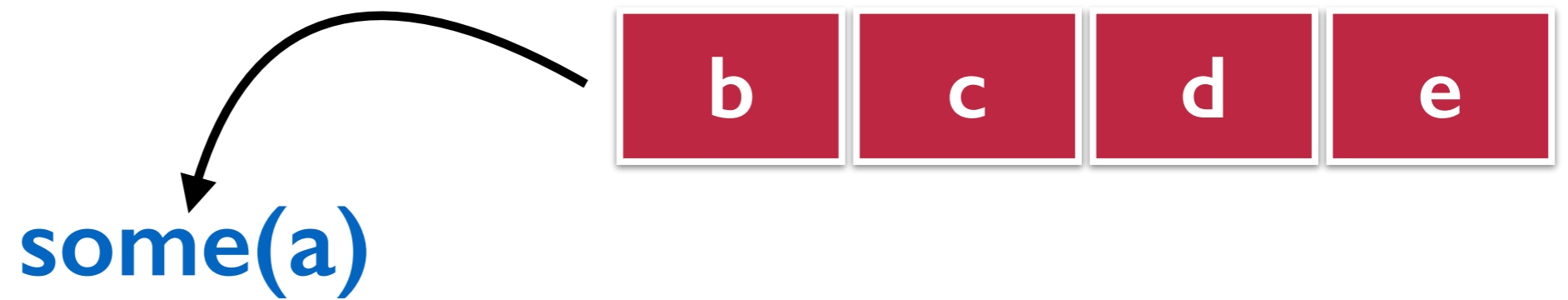
Concurrent Queues

Count the messages!



Concurrent Queues

Count the messages!



Concurrent Queues

Count the messages!



w_i = Work done to process insertion
= $2n$ (where n is the size of queue)
= 'ins' and 'e' travel to end of queue

w_d = Work done to process deletion
= 2 (sends back 'some' and 'a')

Type for Queues

$$\begin{aligned} \text{queue}_{\mathbf{A}}[\mathbf{n}] = \&\{ \text{ins}^{2\mathbf{n}} : \mathbf{A} \multimap \text{queue}_{\mathbf{A}}[\mathbf{n} + \mathbf{1}], \\ &\text{del}^2 : \oplus \{ \text{none} : \mathbf{1}, \\ &\quad \text{some} : \mathbf{A} \otimes \text{queue}_{\mathbf{A}}[\mathbf{n} - \mathbf{1}] \} \} \end{aligned}$$

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Resource-Aware Session Types

types augmented with potential information
sender pays potential with message
receiver gets potential with message

Type for Queues

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```
(x : A) (t : queue_A[n])  $\stackrel{0}{\vdash}$  elem :: (s : queue_A[n + 1])
  s  $\leftarrow$  elem  $\leftarrow$  x t =
    case s (ins  $\Rightarrow$  y  $\leftarrow$  recv s ;
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Type for Queues

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$$\text{del}^2 : \oplus\{\text{none} : \mathbf{1},$$

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recv 2(n+1) units

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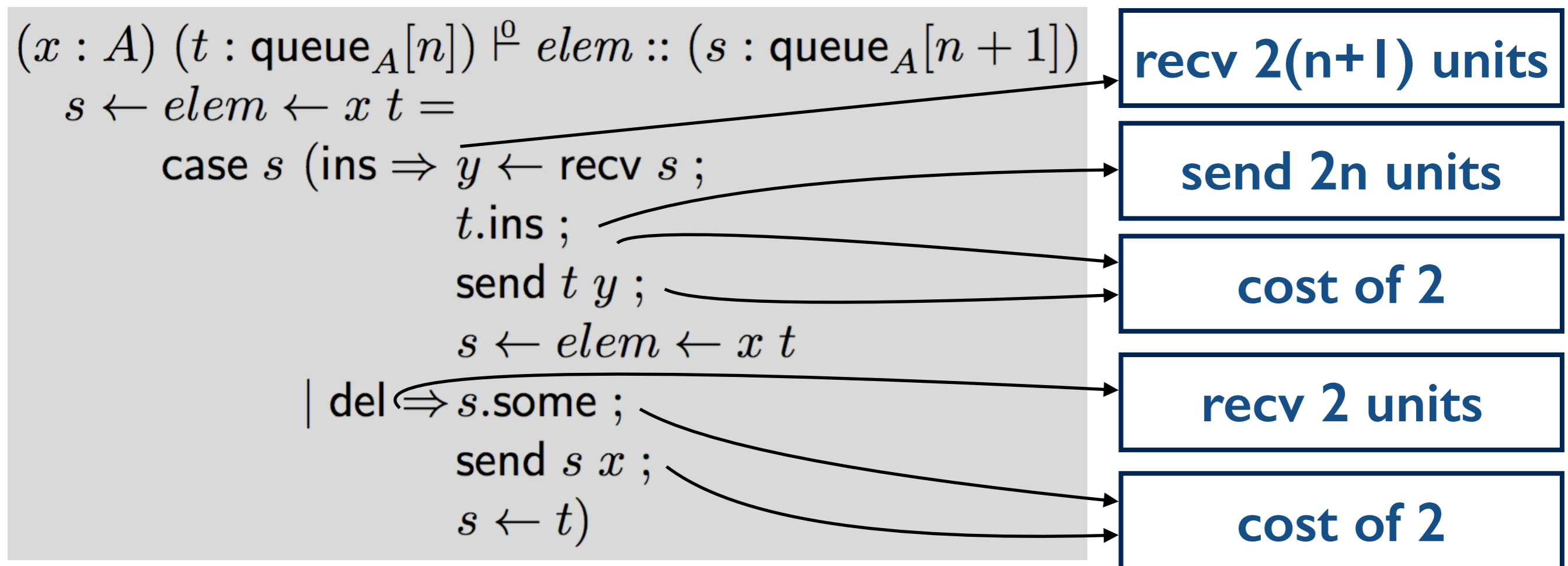
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Type for Queues

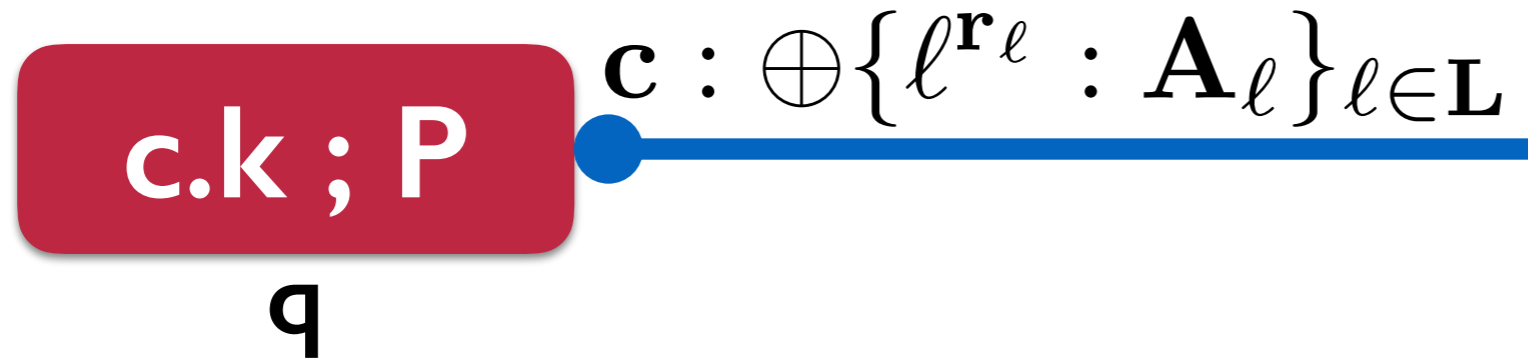
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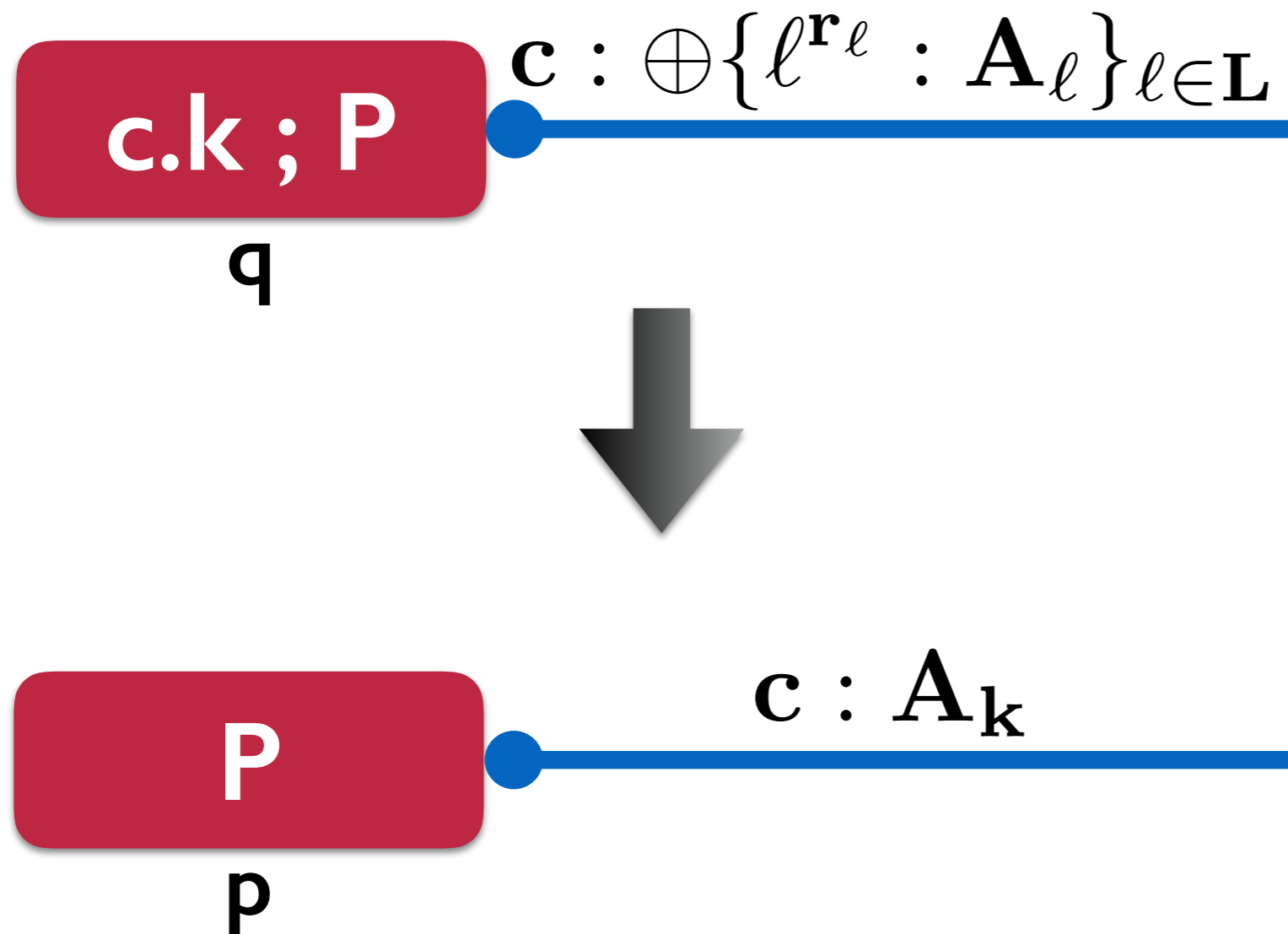


Rule: Sending a label



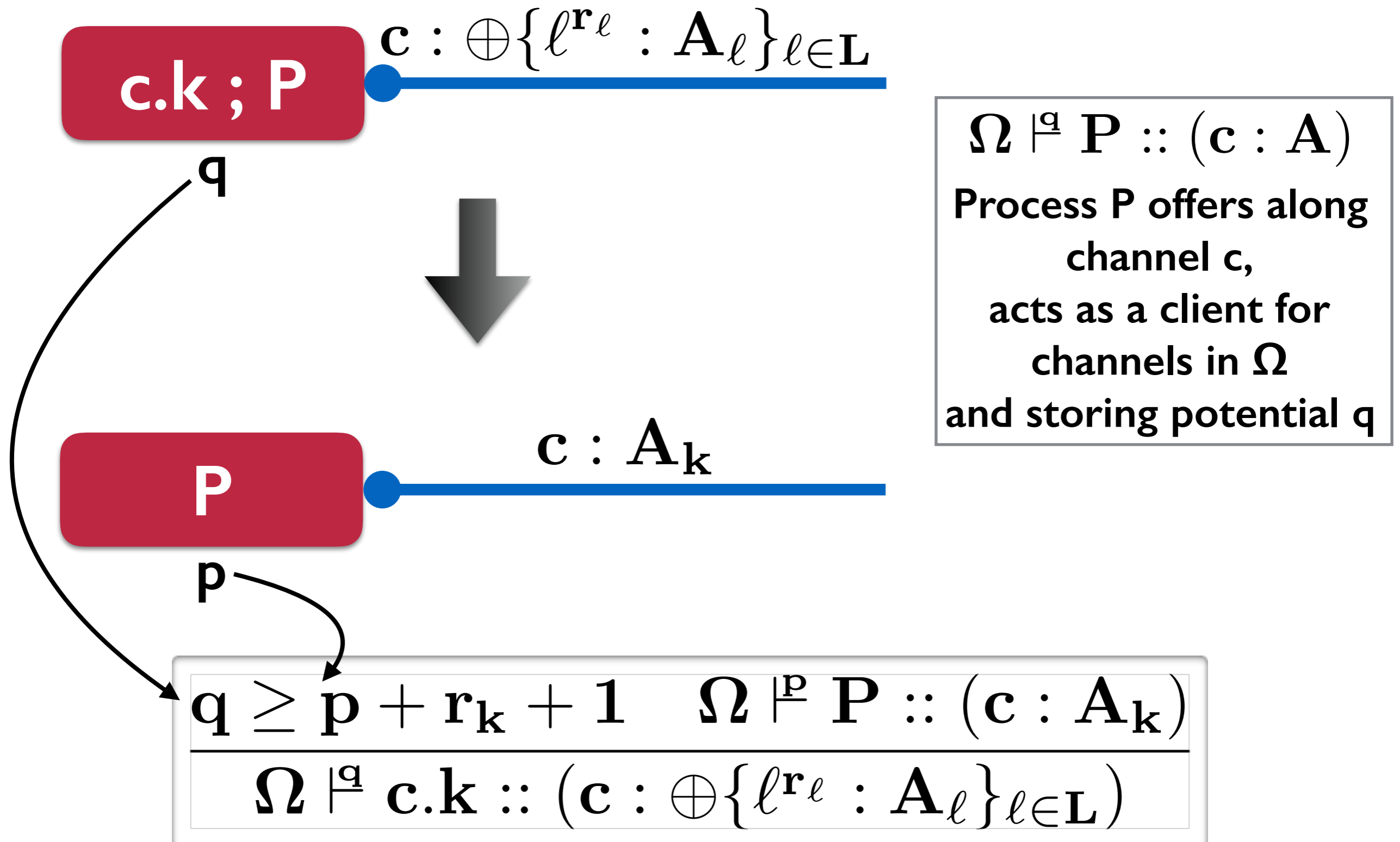
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Process P offers along
channel c ,
acts as a client for
channels in Ω
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Features of Type System

- **Flexible:** supports counting of different resources (e.g. messages exchanged, processes spawned, etc.) by being parametric in cost model
- **Compositional:** types describe individual processes, not just whole programs
- **Precise:** potential upper bounds work accurately
- **Conservative:** strict extension of type system
- **General:** works on most standard examples
- **Automatic:** future work

Examples!

Binary Counters

$$\text{ctr}[\mathbf{n}] = \&\{\text{inc}^1 : \text{ctr}[\mathbf{n} + \mathbf{1}], \\ \text{val}^{2^{\lceil \log(\mathbf{n} + \mathbf{1}) \rceil} + 2} : \text{bits}\}$$

- **Increment:**
 - requires one unit of potential
 - uses amortized analysis!
- **Value:**
 - requires logarithmic potential
 - precise work bound

Stacks vs Queues

$$\begin{aligned} \text{stack}_{\mathbf{A}}[\mathbf{n}] = \&\{ \text{ins}^0 : \mathbf{A} \multimap \text{stack}_{\mathbf{A}}[\mathbf{n} + \mathbf{1}], \\ &\text{del}^2 : \oplus \{ \text{none} : \mathbf{1}, \\ &\quad \text{some} : \mathbf{A} \otimes \text{stack}_{\mathbf{A}}[\mathbf{n} - \mathbf{1}] \} \} \end{aligned}$$

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Which one's more efficient?

Stacks vs Queues

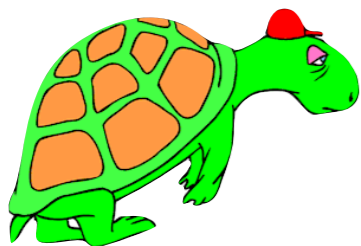
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Contributions

Type System for Work Analysis

based on amortized analysis

types augmented with potential information

work is upper bounded by potential

Flexible, Compositional, Precise, Conservative,
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Cost Semantics

Examples

stacks, queues, binary counters

efficiency comparison

list examples: append, map, fold