

# Verifying and Synthesizing Constant-Resource Implementations with Types

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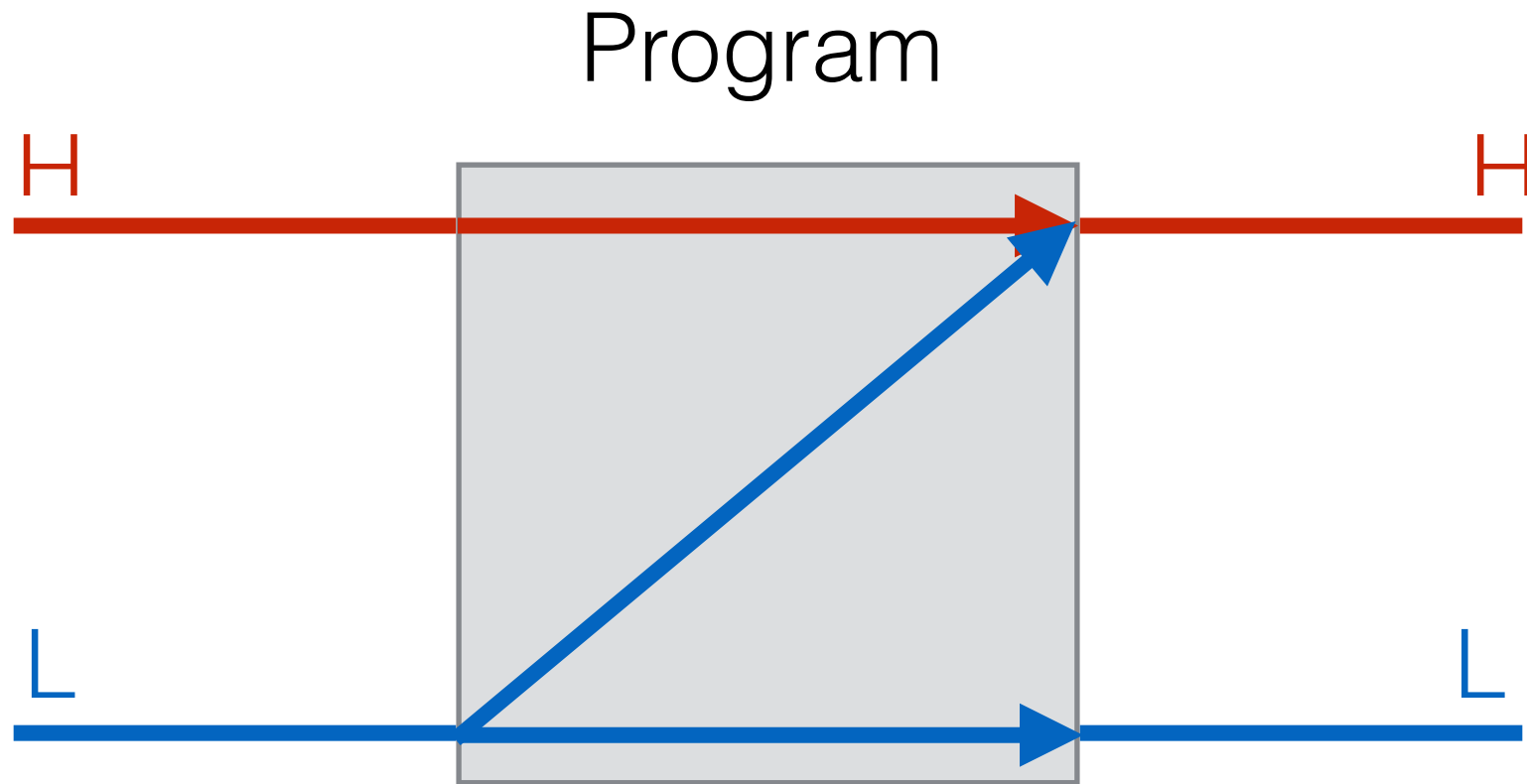
Matt Fredrikson

Jan Hoffmann

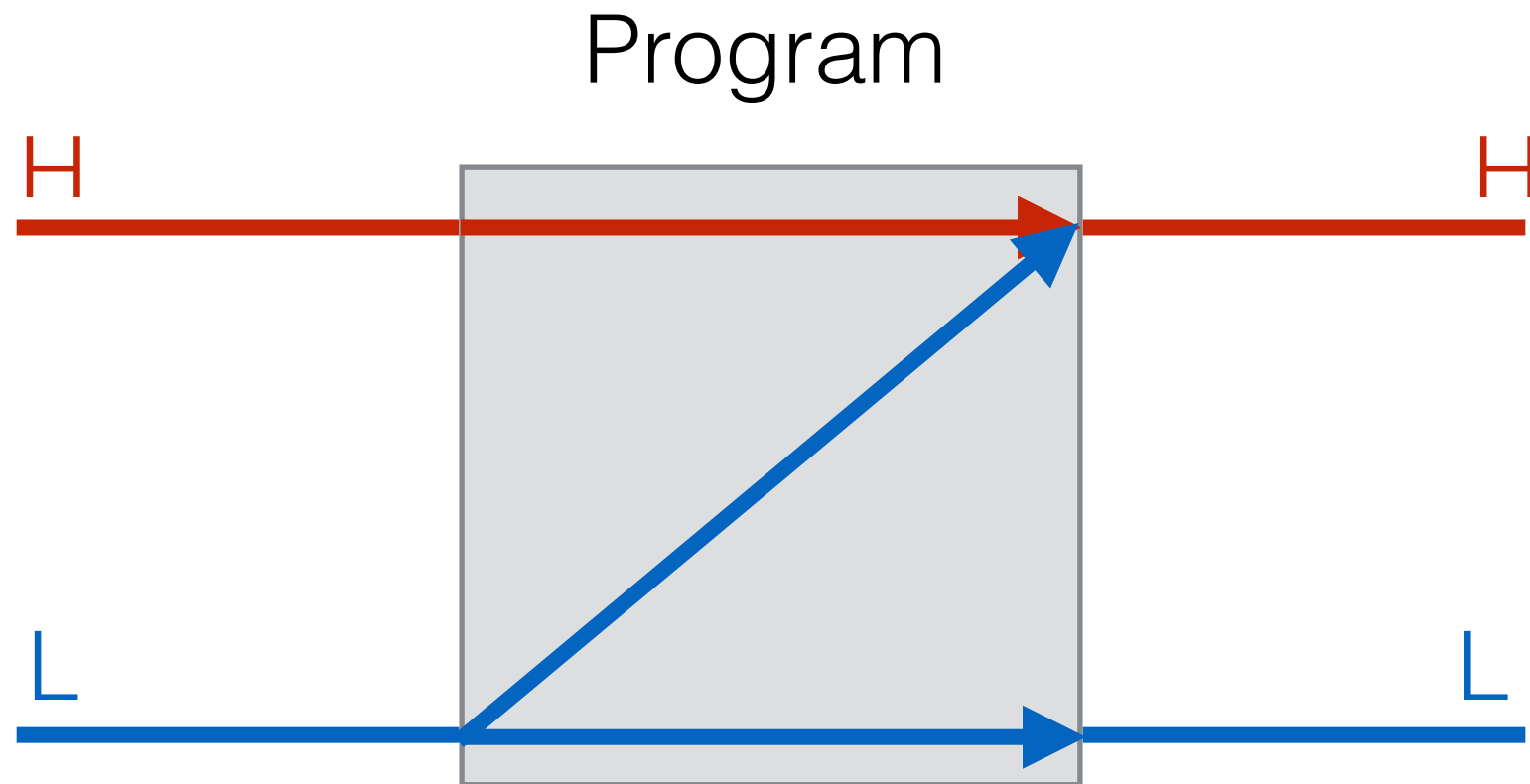
Carnegie Mellon University

S&P Oakland 2017

# Classic non-interference

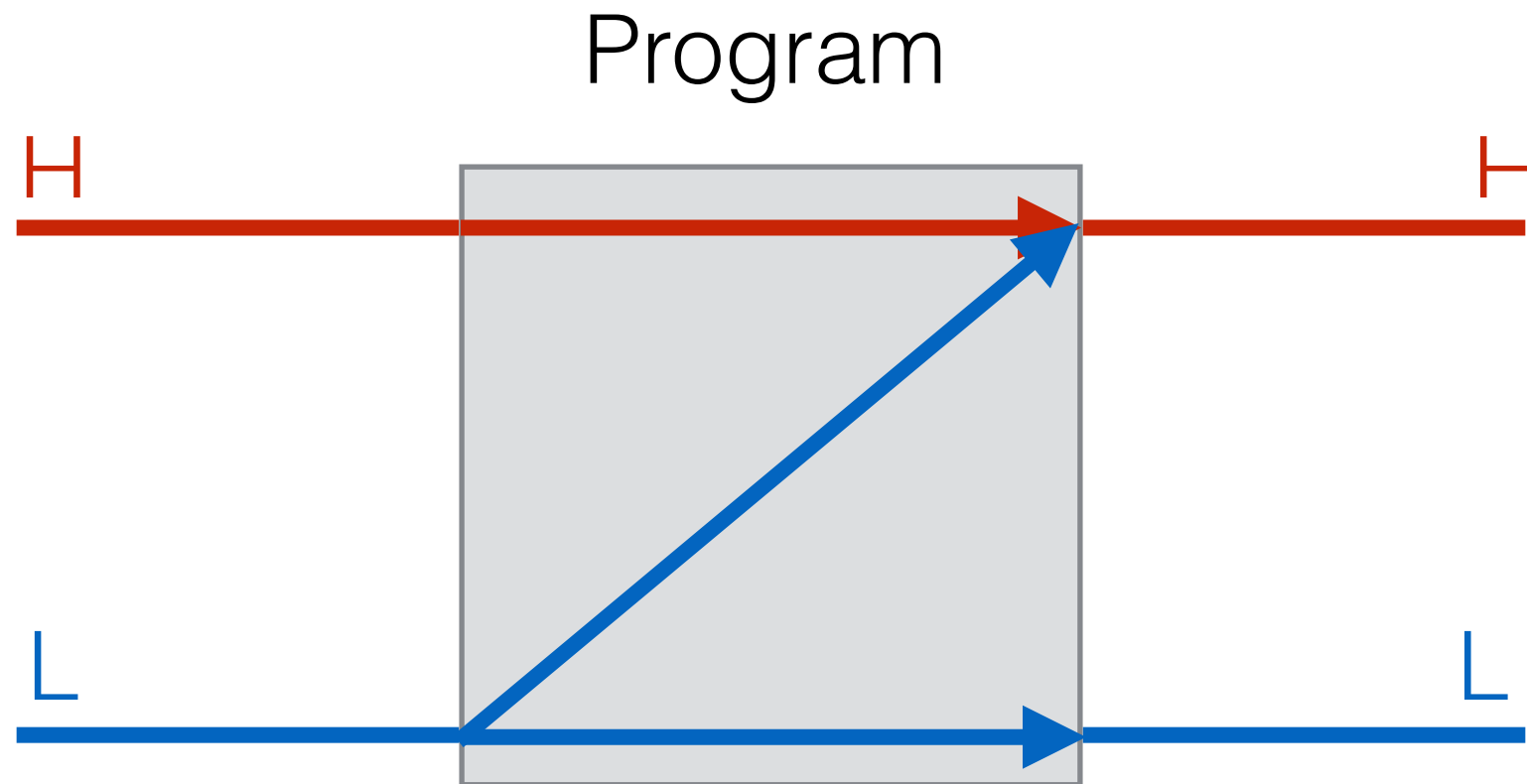


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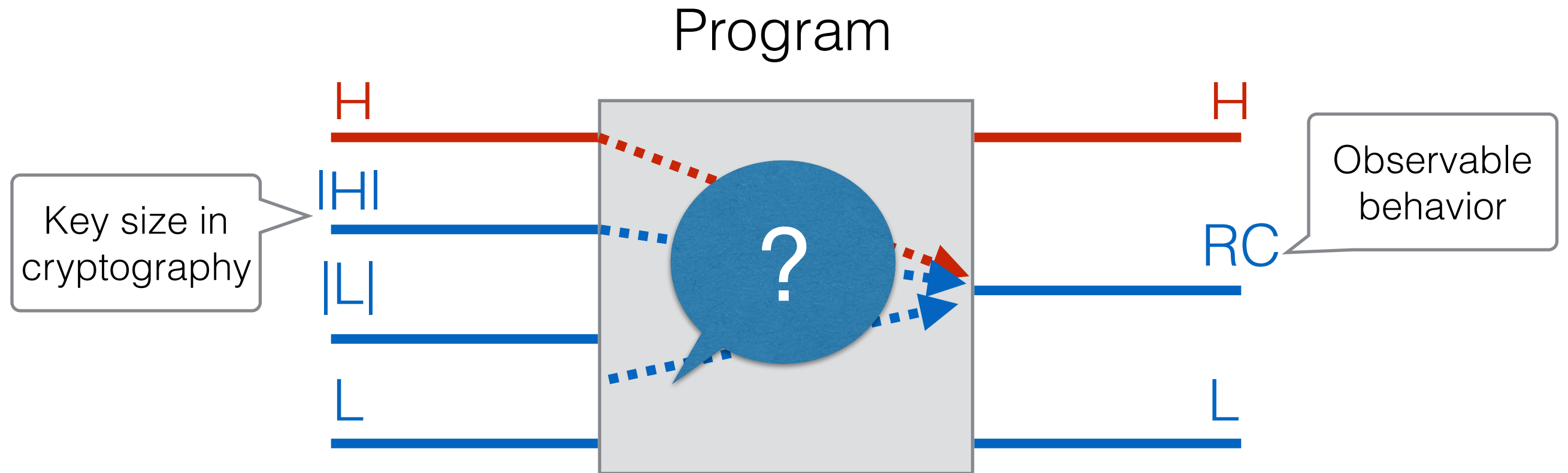
- No high security (H) flows to low security (L)

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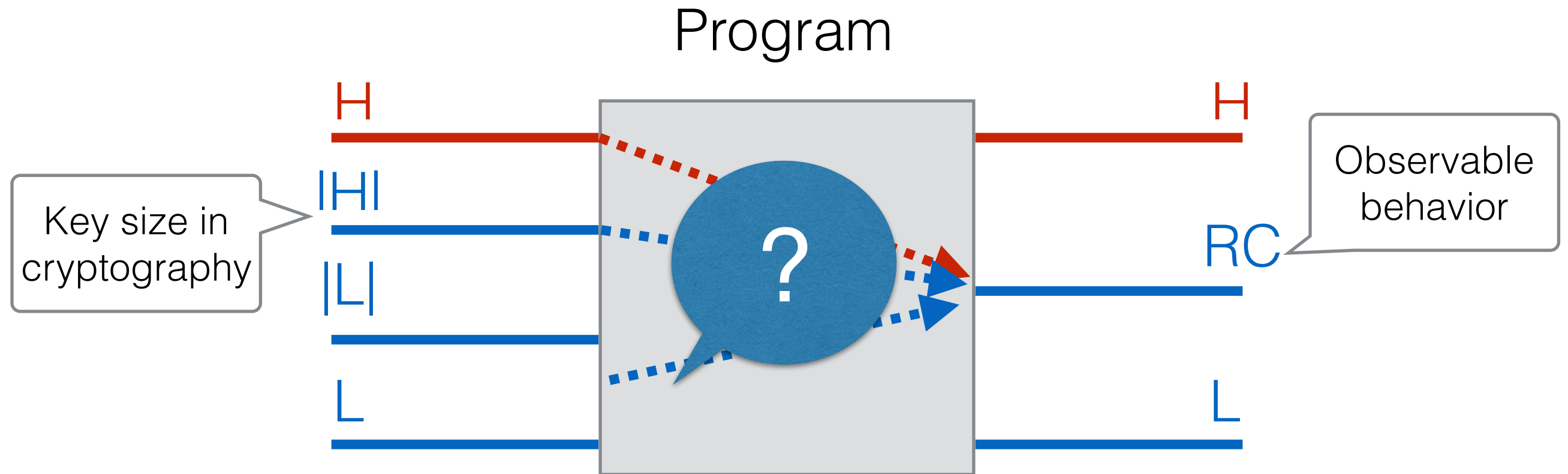


- No high security (H) flows to low security (L)
- High security does not affect low security

# Flow to resource consumption

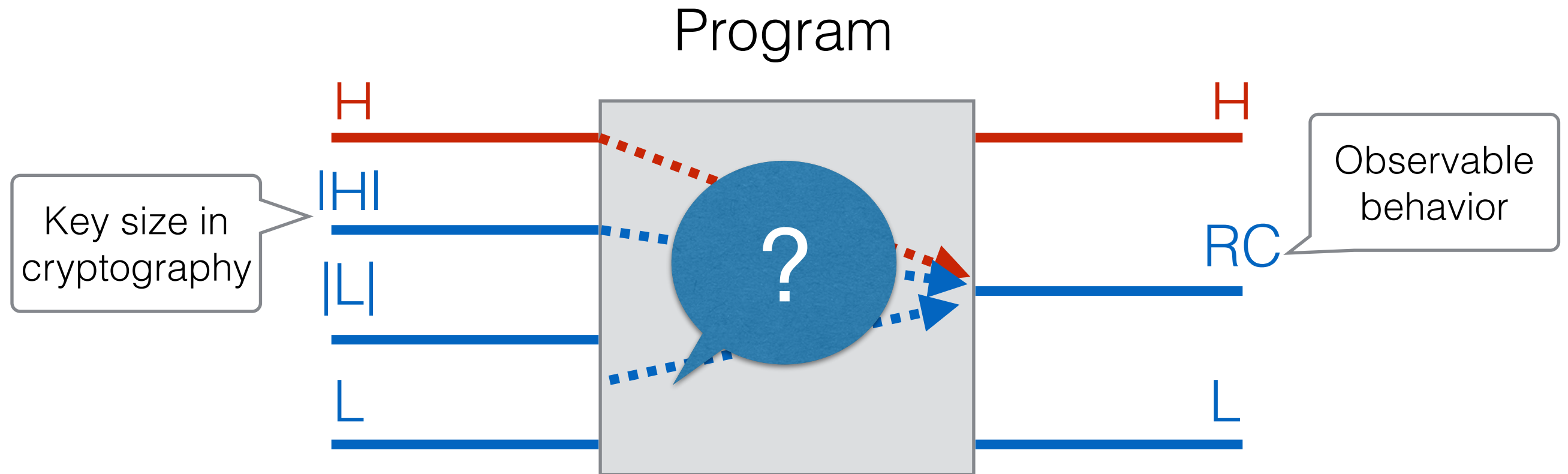


# Flow to resource consumption



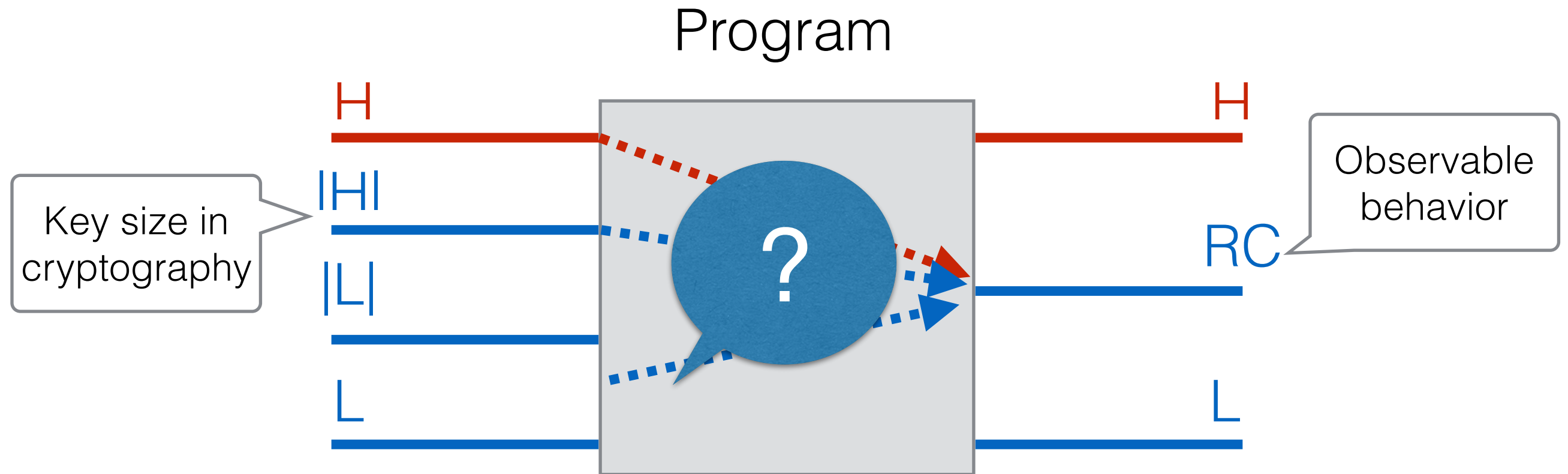
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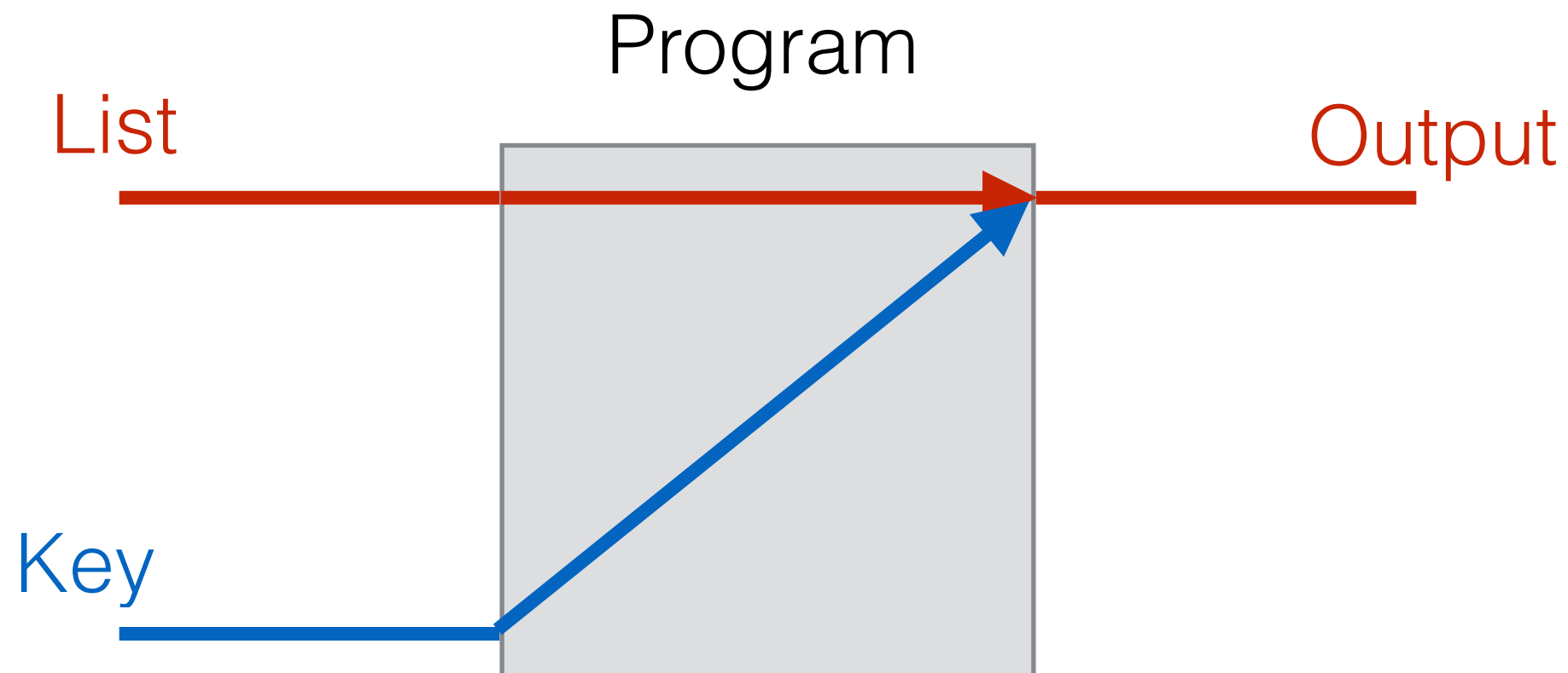


- Sizes of  $H$  ( $|H|$ ) and  $L$  ( $|L|$ ) and resource consumption ( $RC$ ) are low securities
- Nothing about the information flow to  $RC$ 
  - Can  $H$  and  $|H|$  flow to  $RC$  (affect  $RC$ ) ?



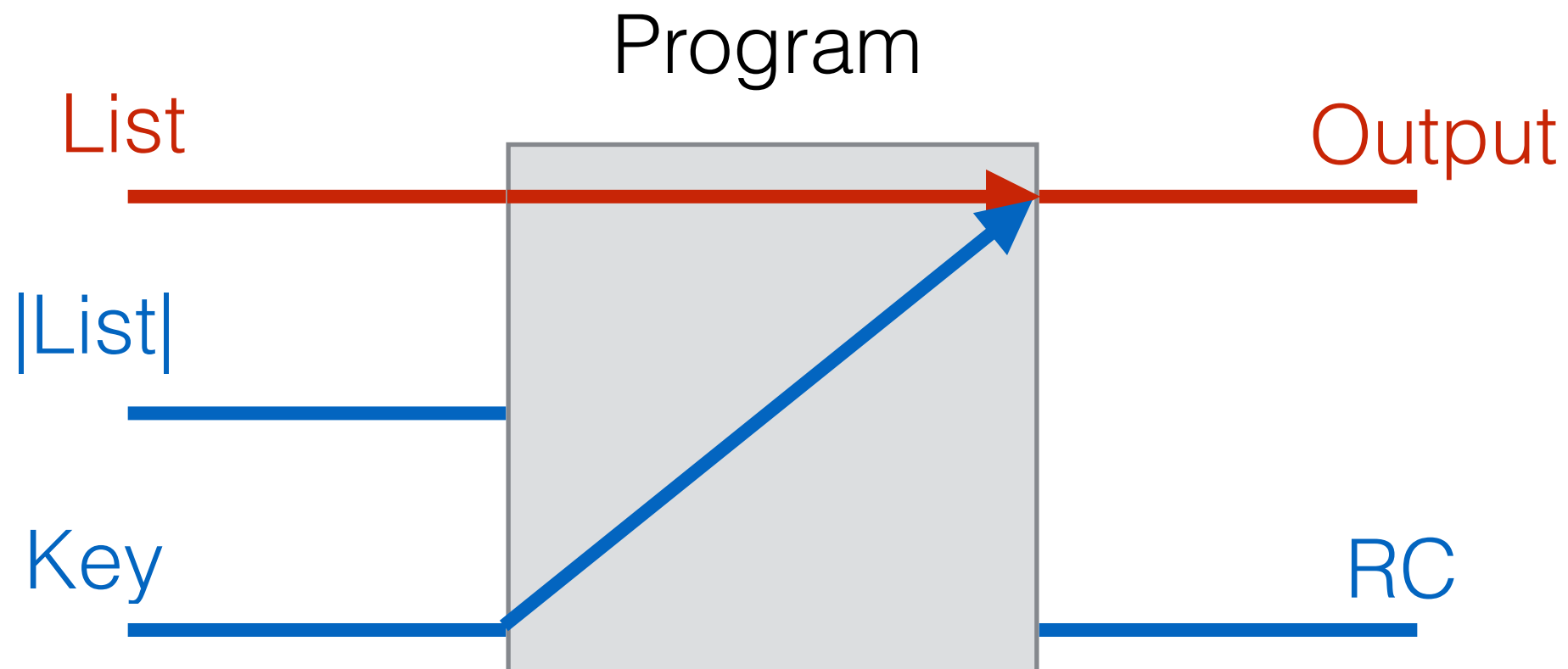
# Example: Sequential search

Checks sequentially the list of items until a match for the key is found



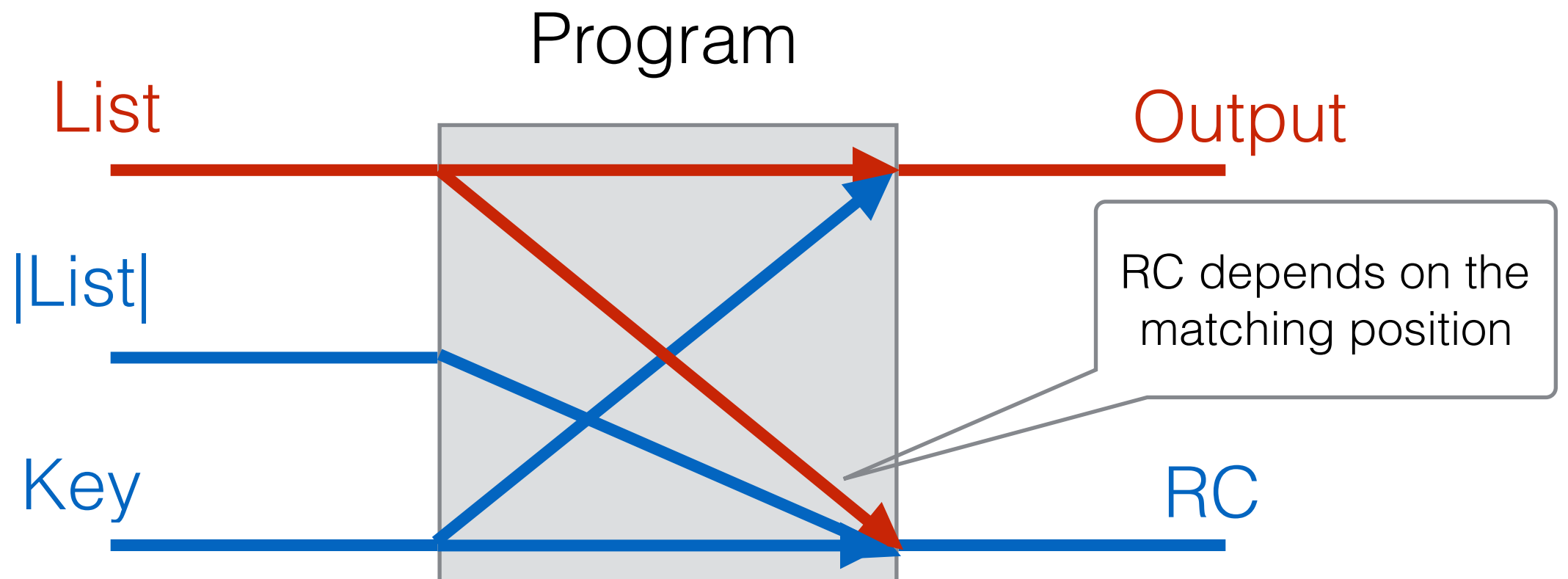
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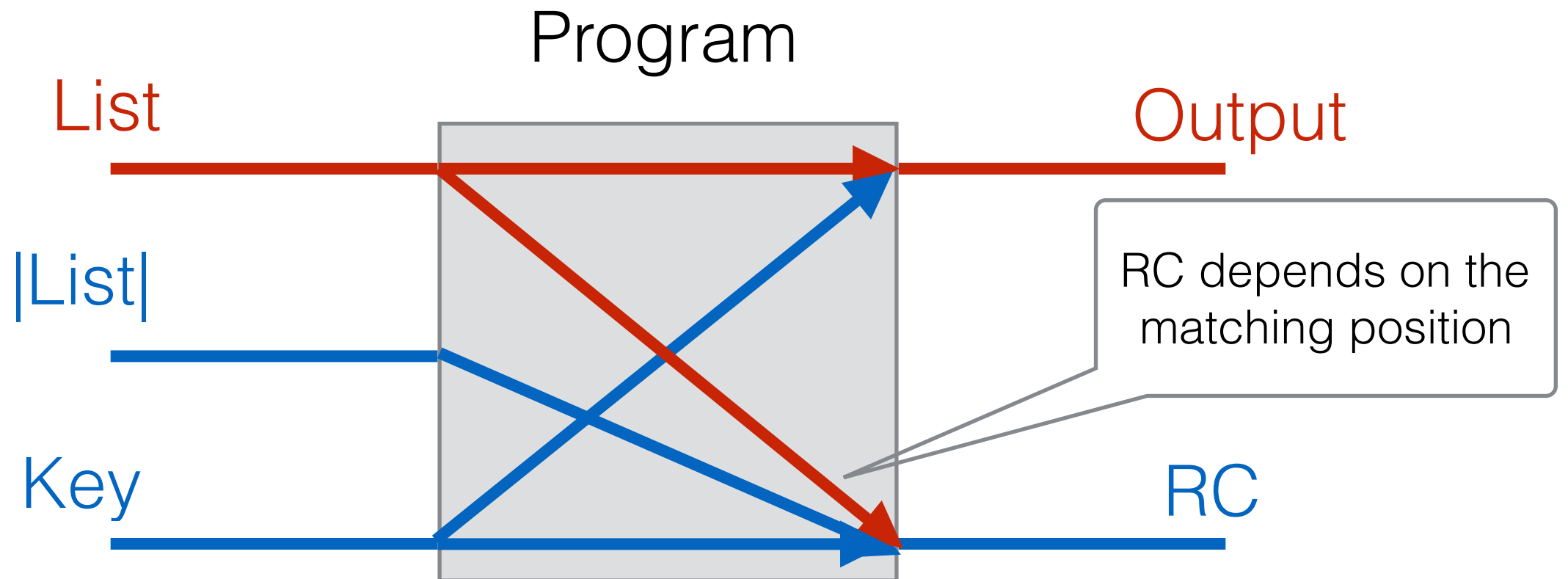
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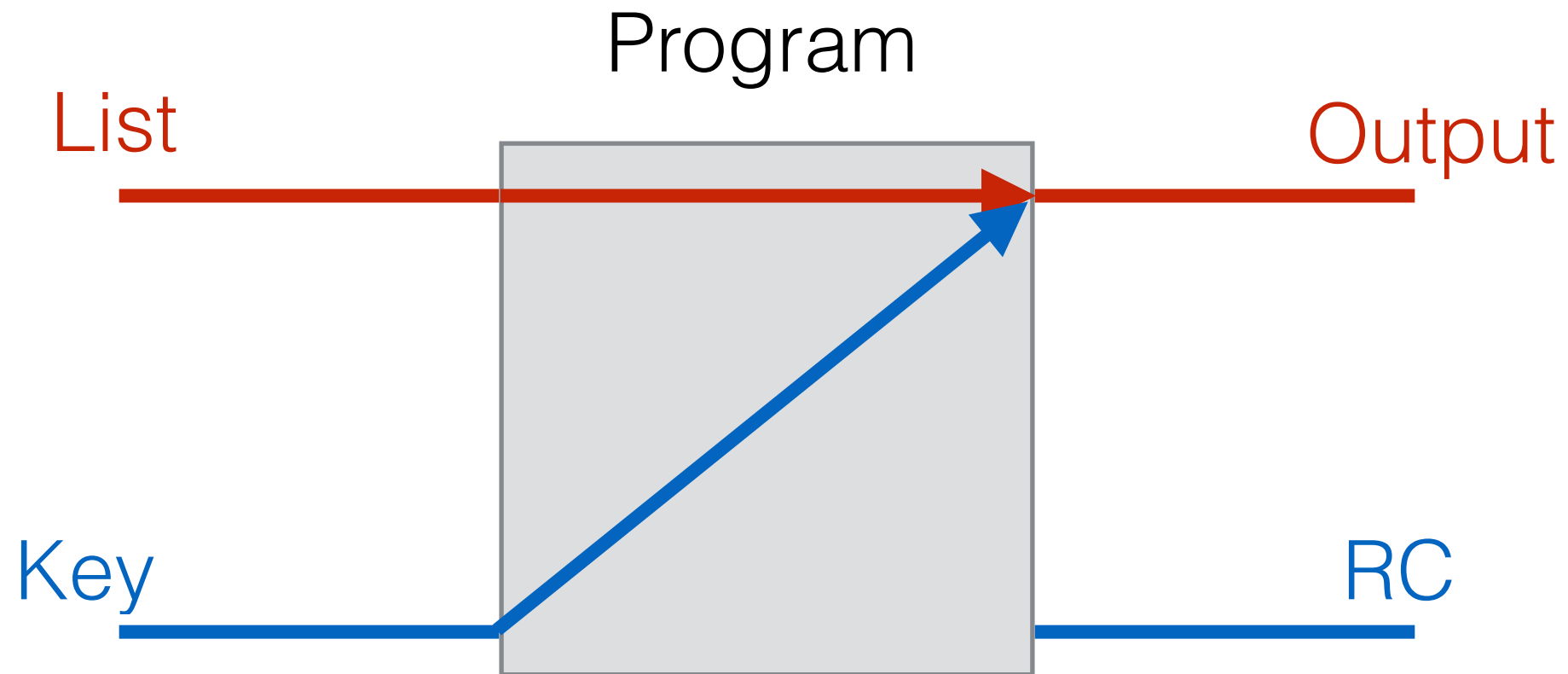
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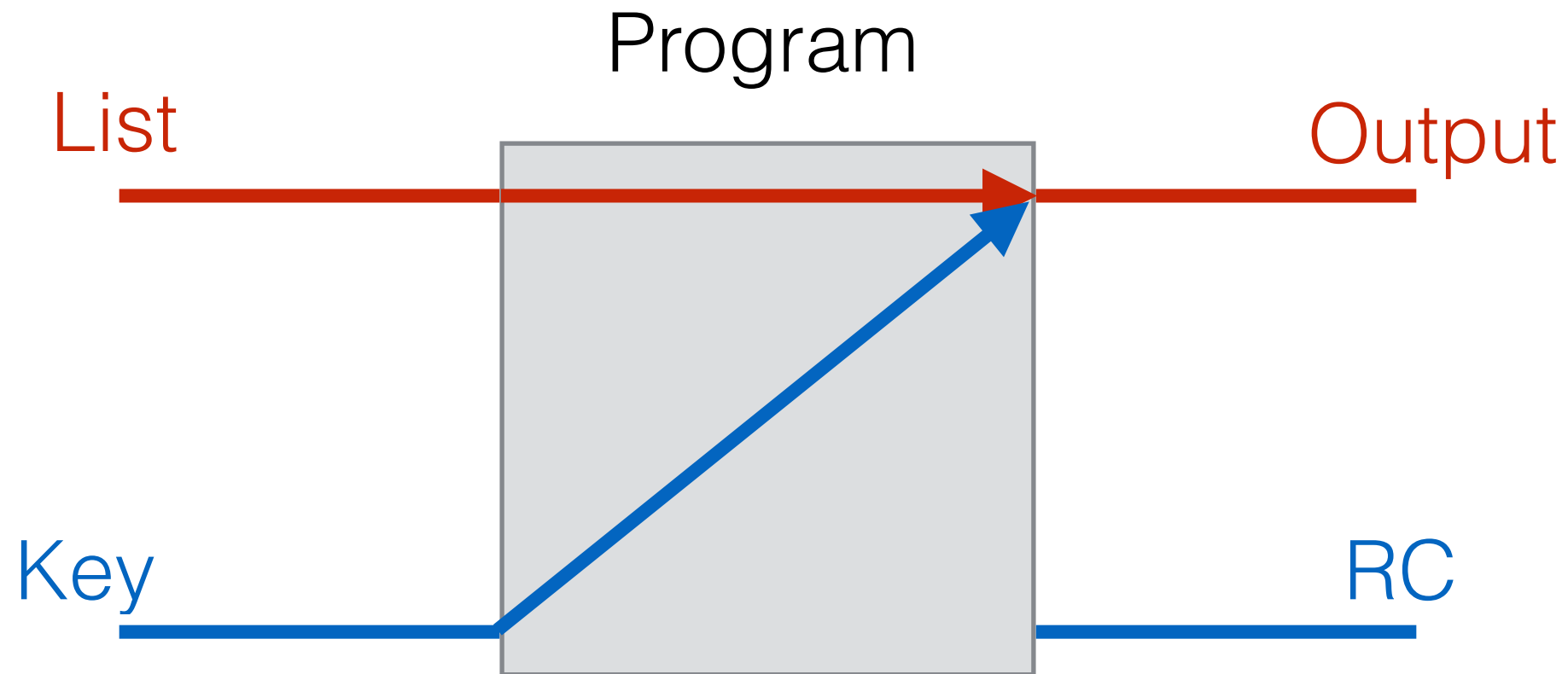


- **Problem:** High security (**List**) affects low security (**RC**)
- **Side channel attacks:** By observing **RC**, **List** can be learned

# Resource-aware non-interference

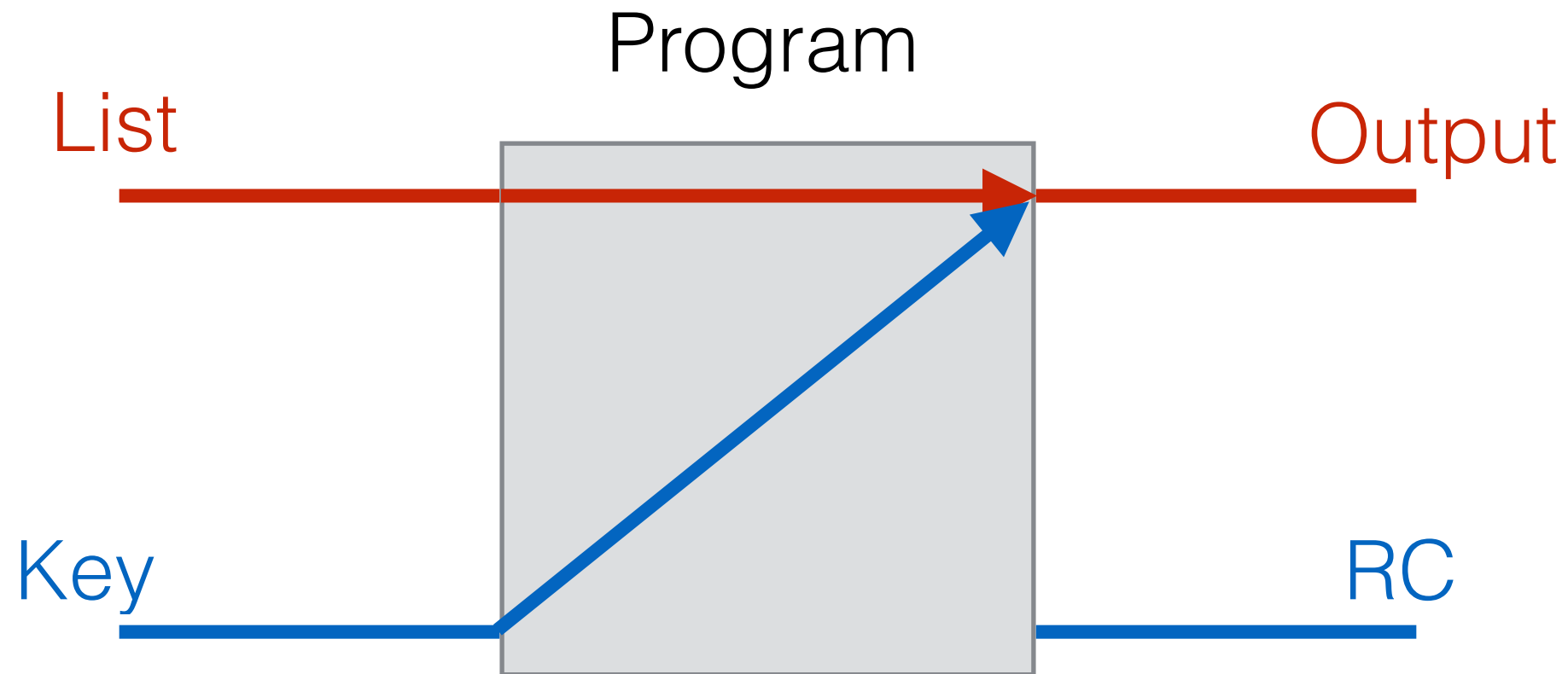


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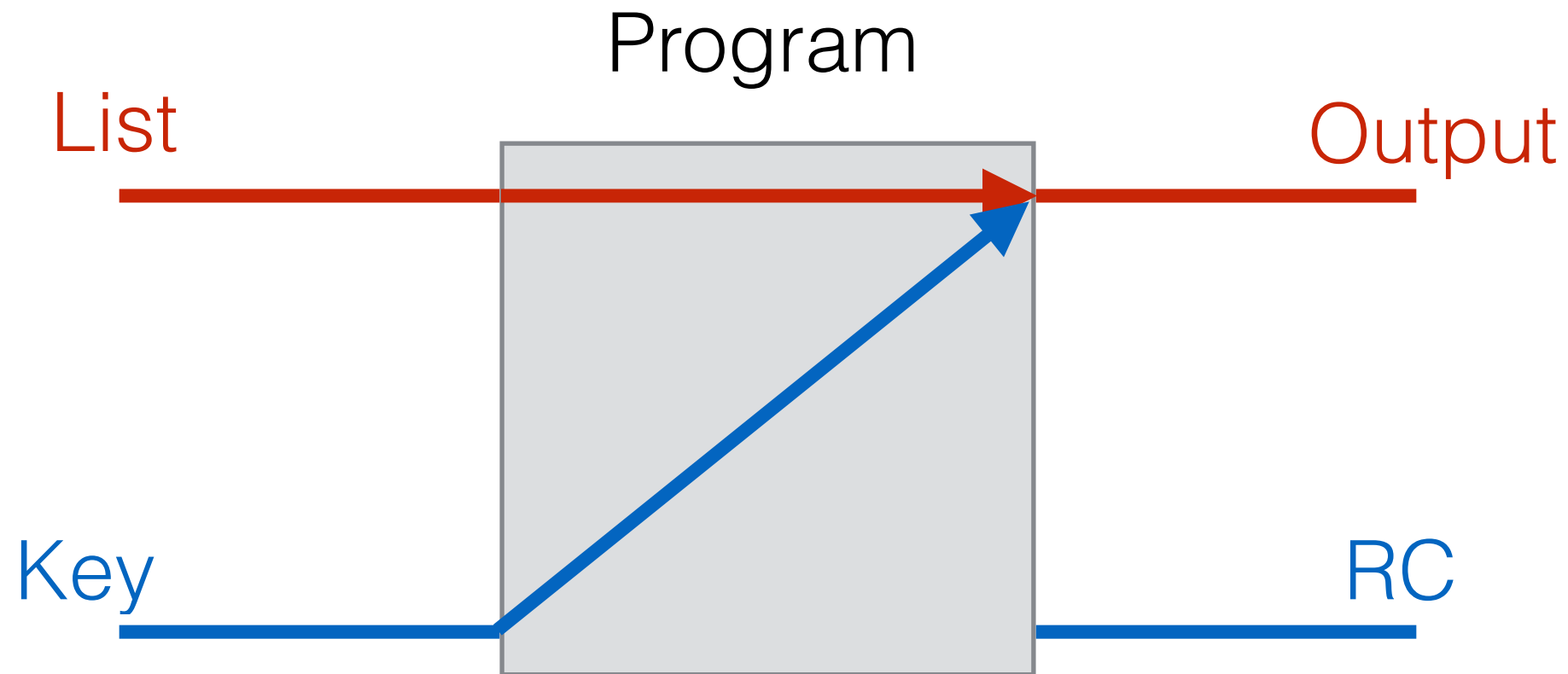
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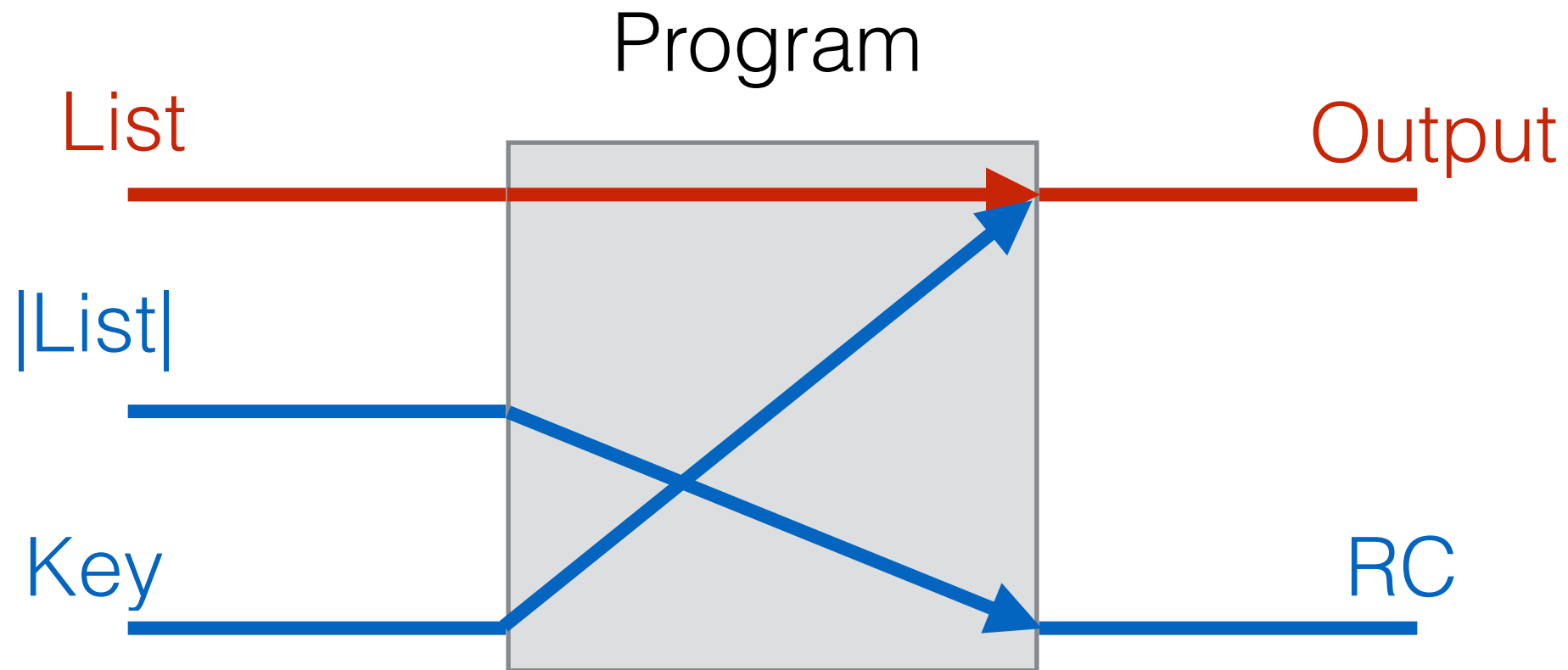
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# Resource-aware sequential search

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let find(k,l) =  
  let rec aux(k,l,res) =  
    match l with  
    | [] -> res  
    | x::xs ->  
      if x = k then  
        tick(1); aux(k,xs,true)  
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# Resource-aware sequential search

Well-typed  
program

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- **Resource type system** proves that resource consumption is constant if input sizes are fixed
- **Security type system** co-operating with resource type system enforces resource-aware non-interference
- Quantification of information leakage of non-constant-resource programs
- Interactive and automatic program repair

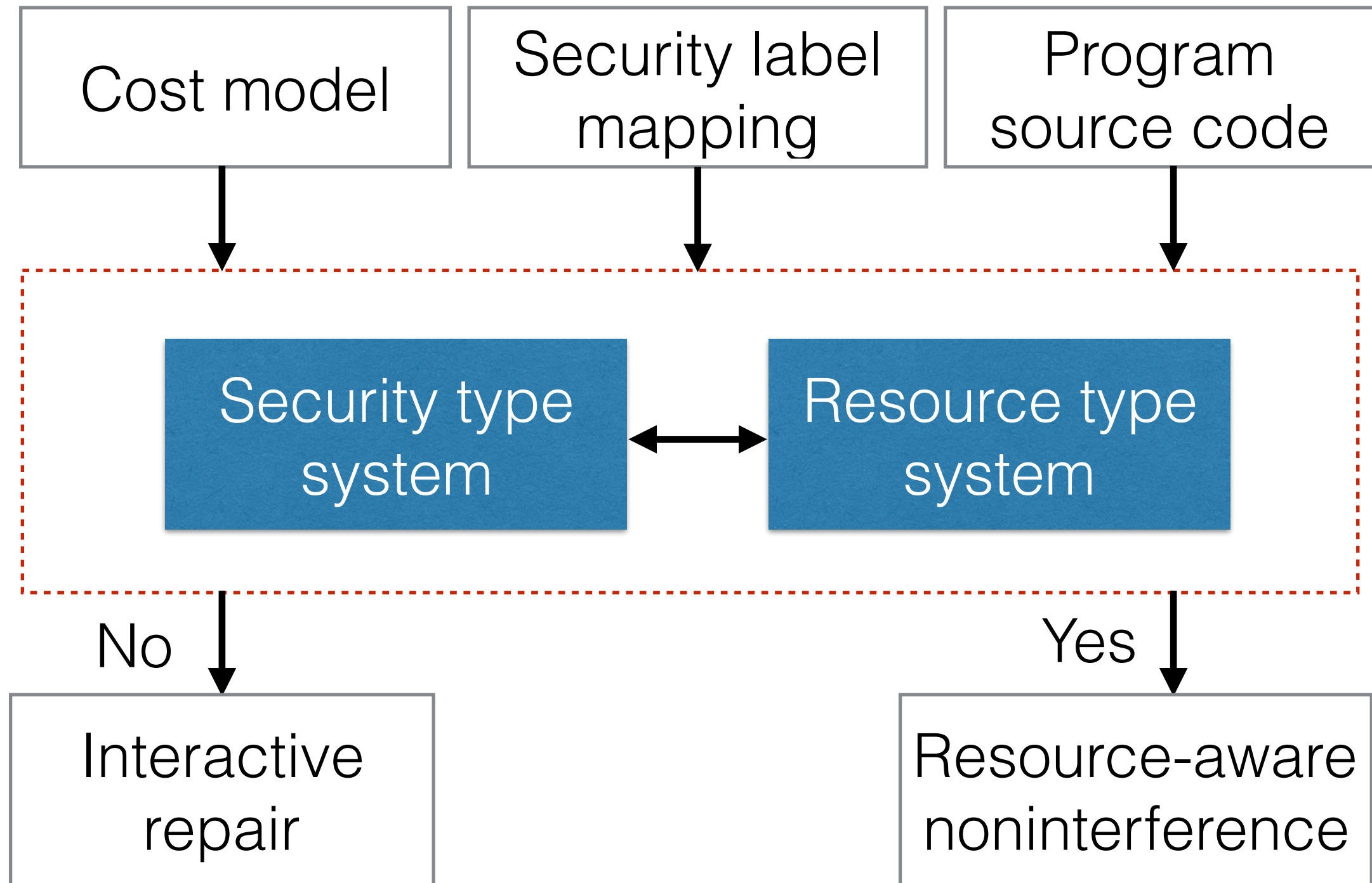
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- **Resource type system** proves that resource consumption is constant if it is type checked
- **Security type system** co-operating with resource type system enforces resource-aware non-interference
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Focus of this talk

# Overview



# Security type system

Judgement:  $pc, \Gamma \vdash^{\text{const}} e : S$   
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- Under security setting  $\Gamma$  and  $pc$ ,  $e$  has type  $S$  and it has non-interference property
- If judgements have  $\text{const}$  annotations then  $e$  satisfies resource-aware non-interference

# Security type system

Program counter

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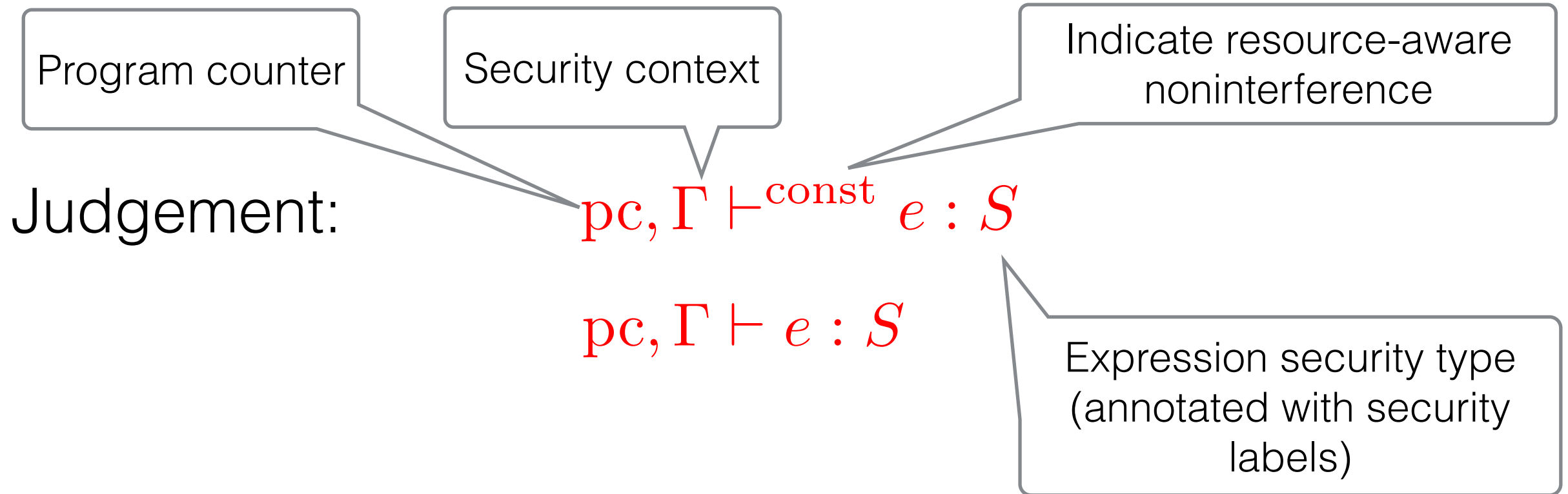
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Expression security type  
(annotated with security  
labels)

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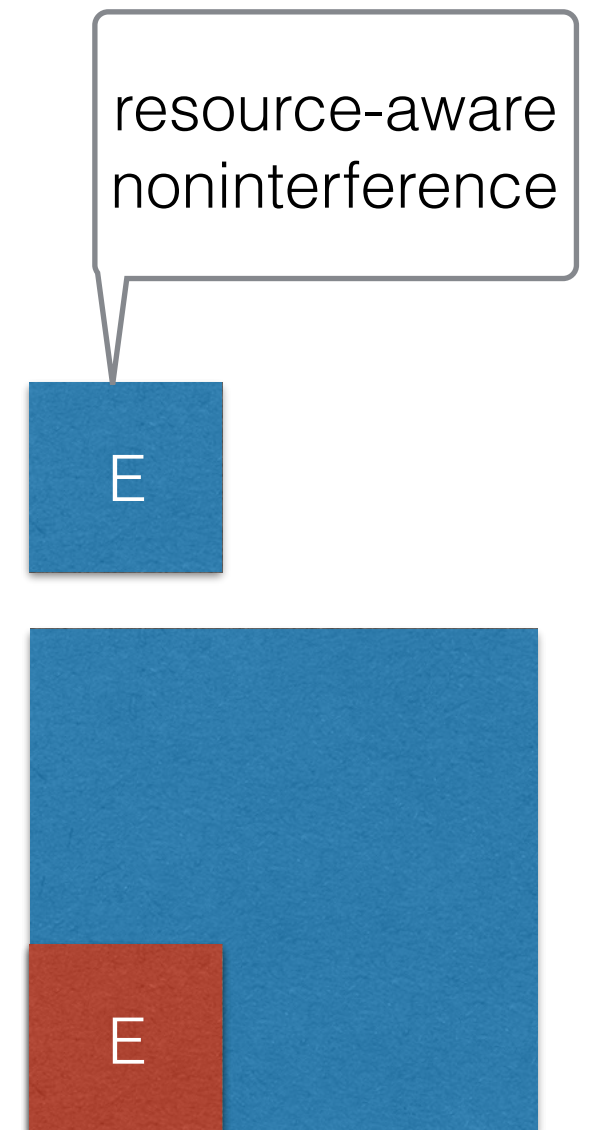
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- Two extreme ways: **globally** and **locally** enforcing
- Global reasoning: using the resource type system to check the whole program is constant-resource
  - *Sound but requires to reason about parts **not affected** by high securities*
- Local reasoning: ensuring every condition branching on high security is constant-resource
  - *Not sufficient and efficient (**rejects valid programs**)*

# Global and local reasoning

- Security type system uses a mix of **global** and **local reasoning**
- Ensure that every expression affected by high security is
  - a resource-aware non-interference, or
  - a part of a resource-aware non-interference (Total resource usage is constant)





# Local reasoning

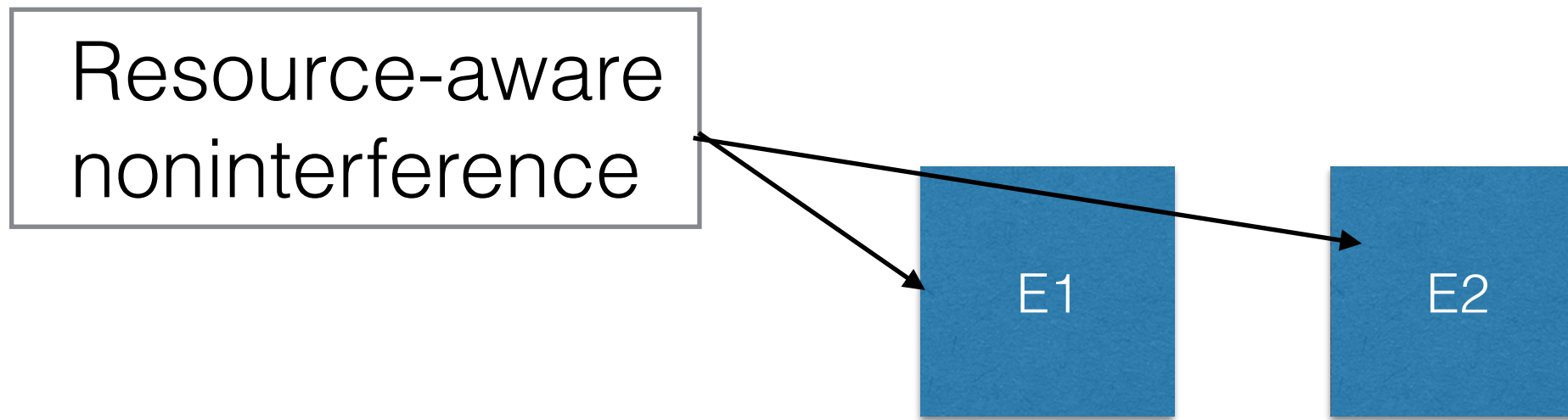
# Local reasoning

Resource-aware  
noninterference

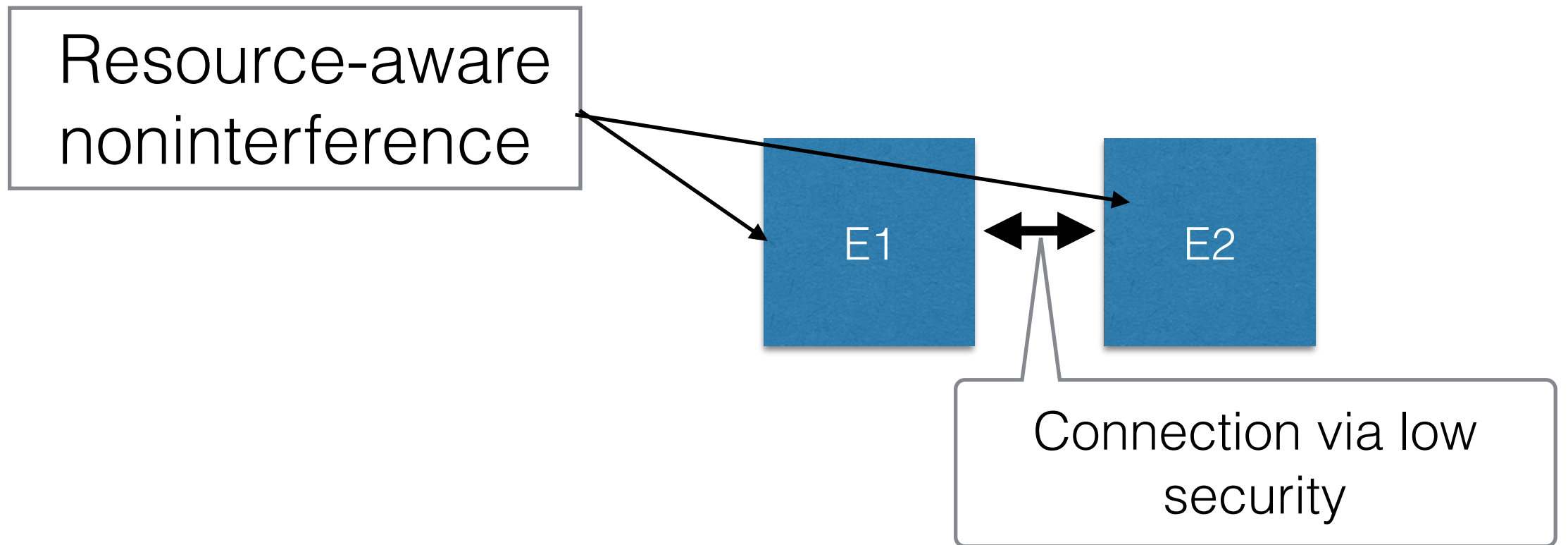


E1

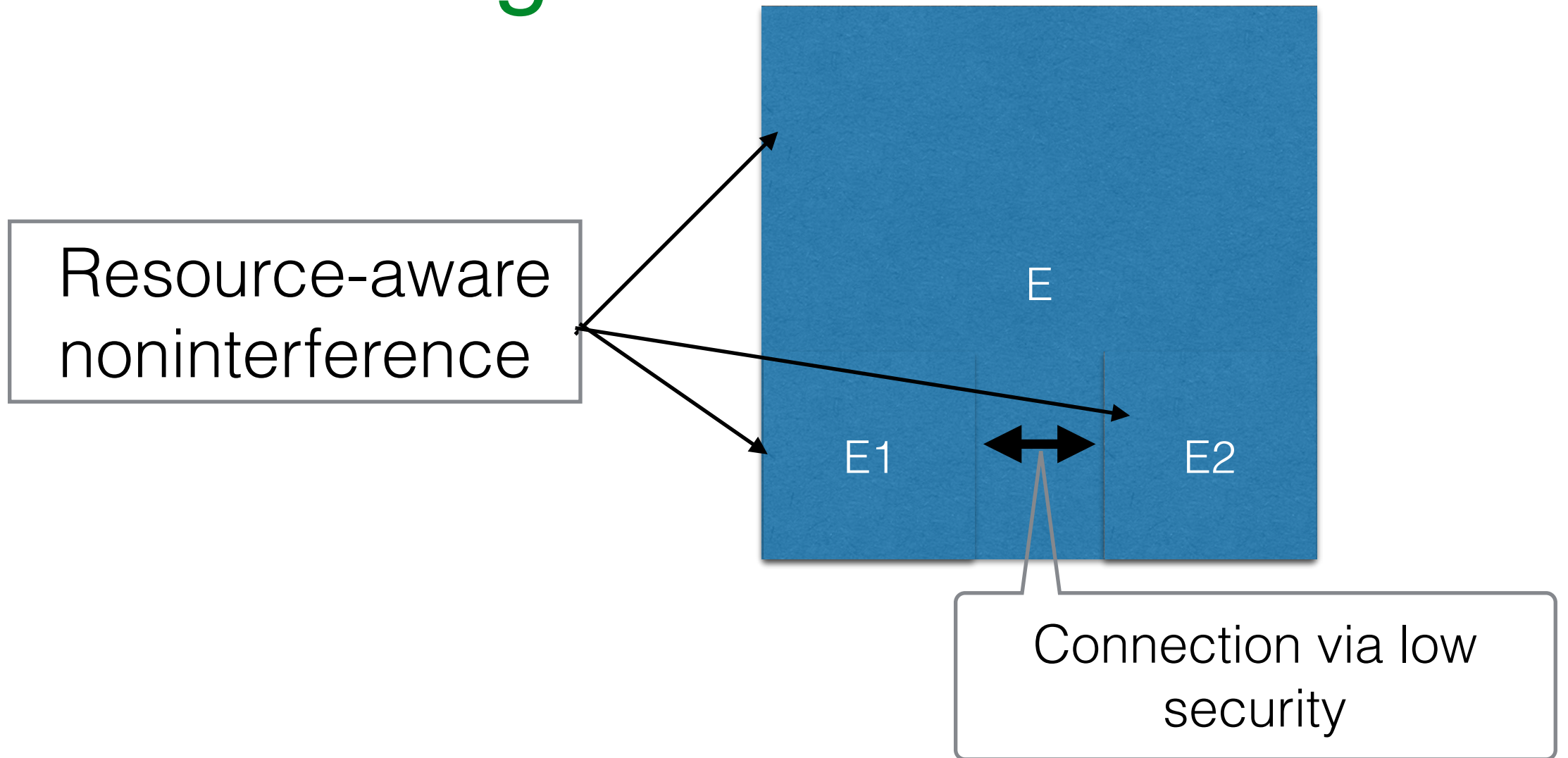
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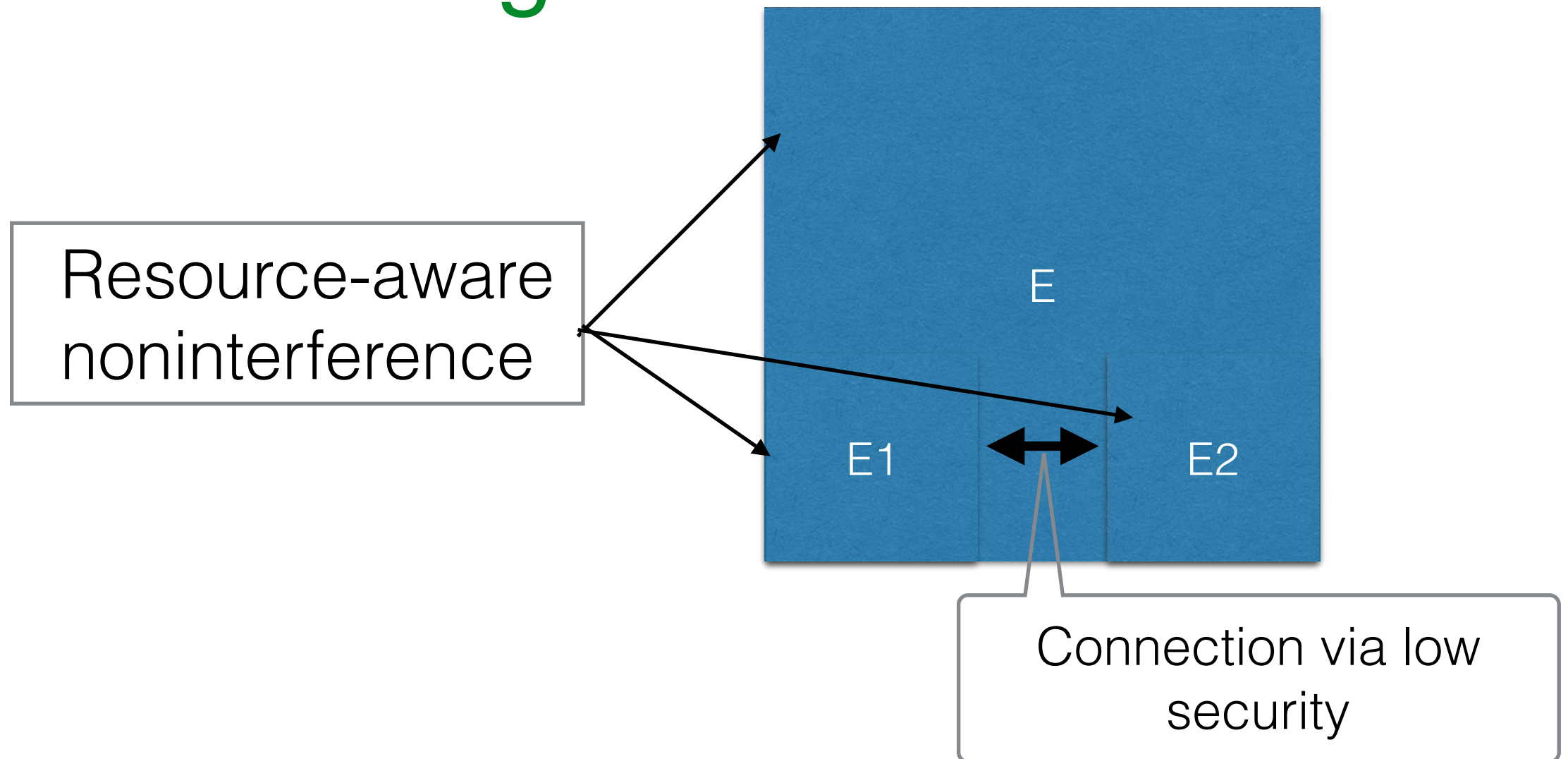
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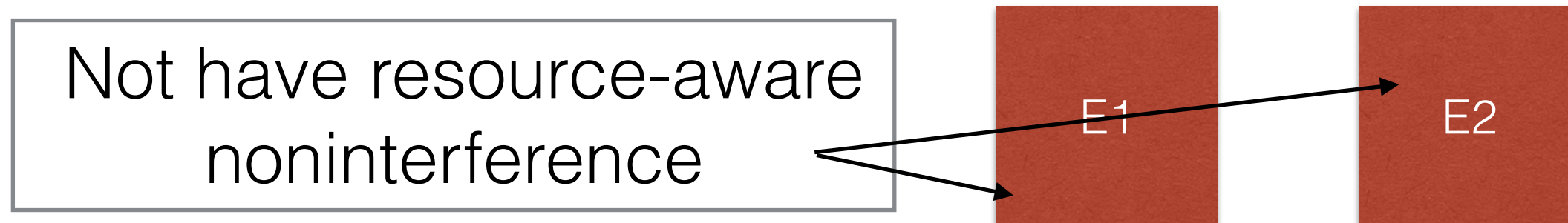


Example: rule for low security condition

$$\frac{\dots \quad \frac{\text{const}}{\vdash} e_t : S \quad \dots \quad \frac{\text{const}}{\vdash} e_f : S \quad k_x \sqsubseteq h}{\dots \quad \frac{\text{const}}{\vdash} \text{if}(x, e_t, e_f) : S}}$$

# Global reasoning

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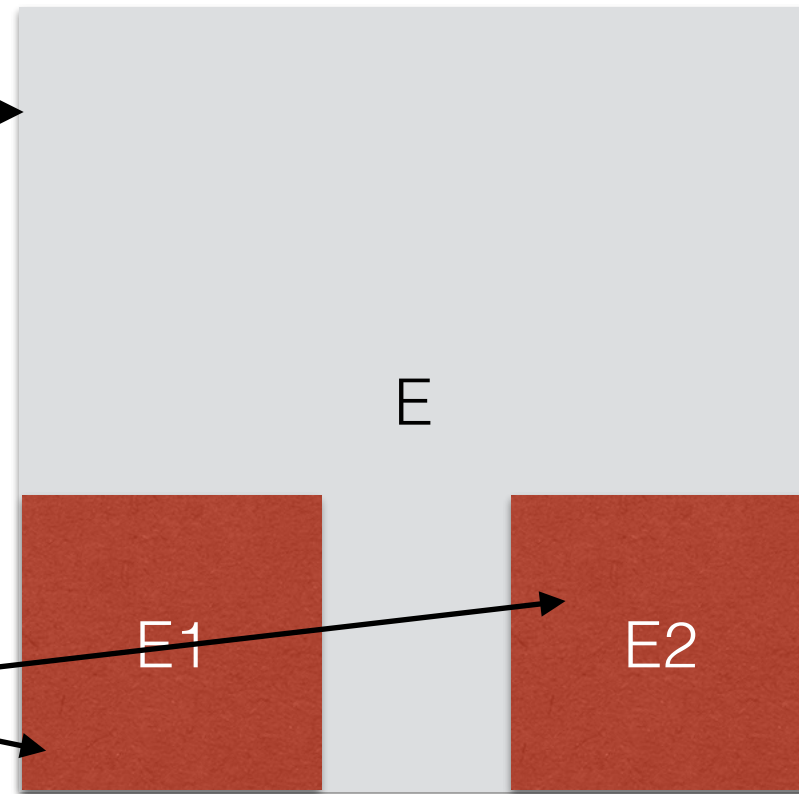


# Global reasoning

Constant resource



Not have resource-aware  
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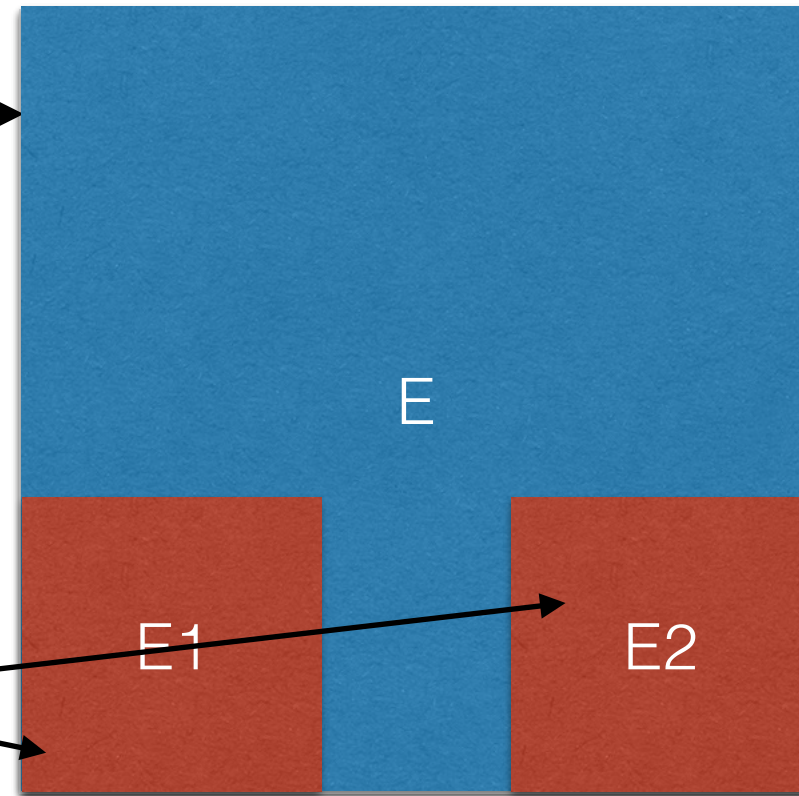


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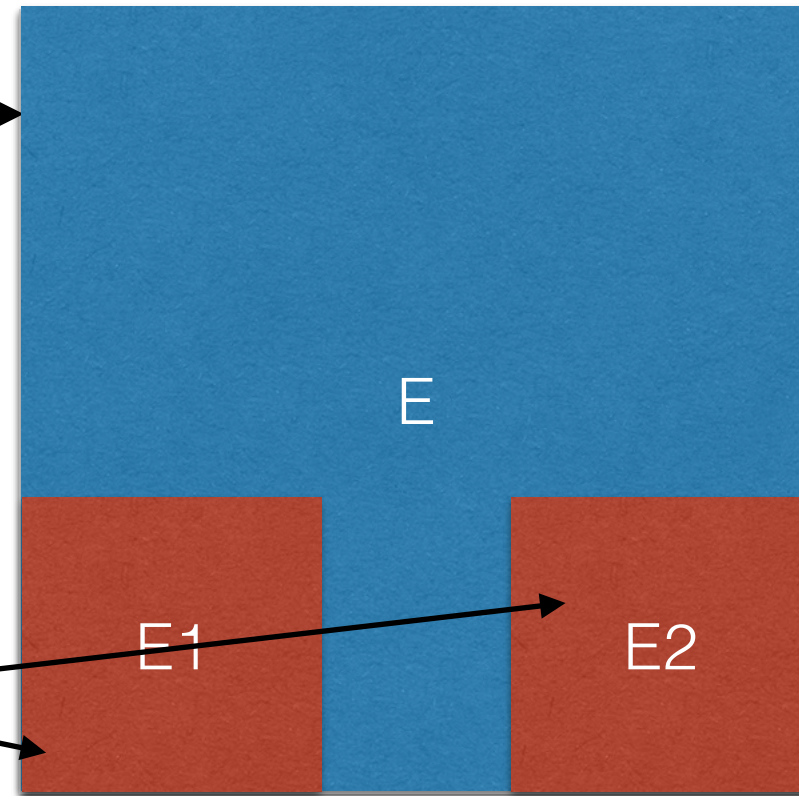
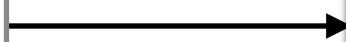


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# Global reasoning

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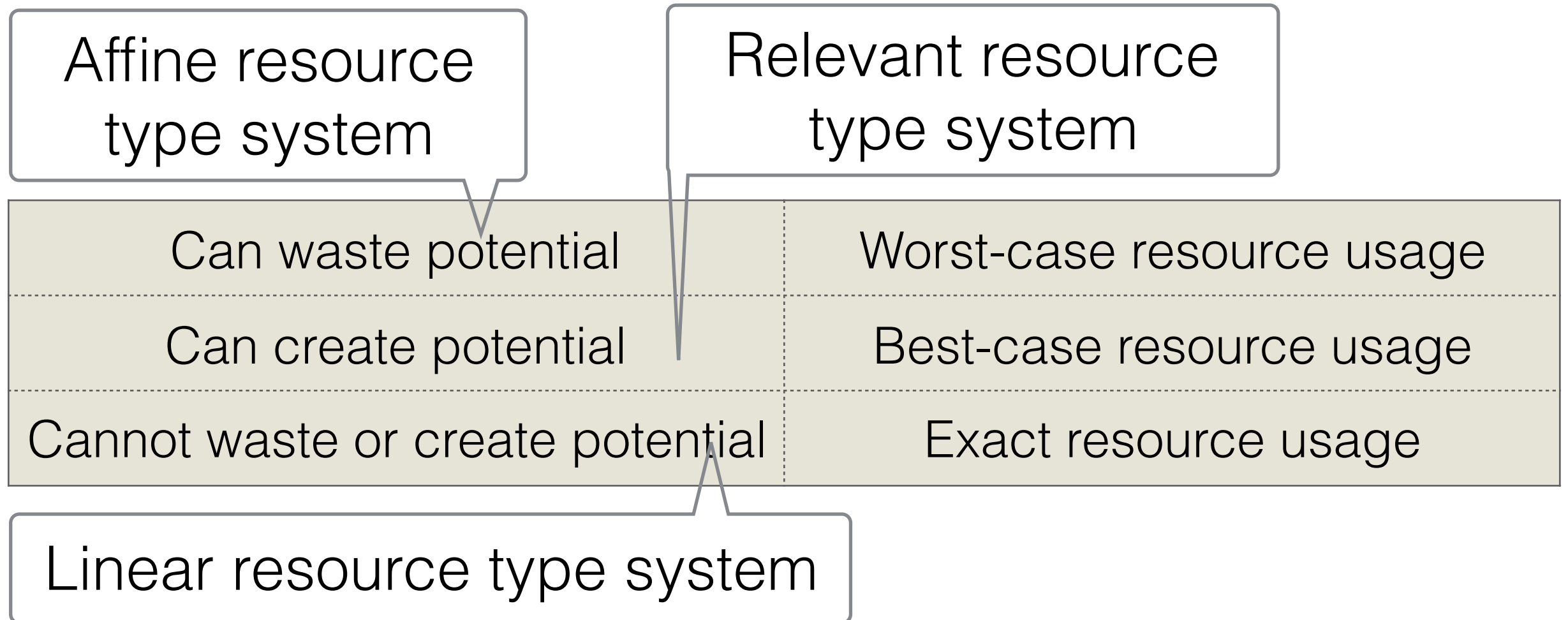
Not have resource-aware noninterference



Example: rule for cooperating with resource type system

$$\frac{\dots \vdash e : S \quad \text{const}(e)}{\dots \overset{\text{const}}{\vdash} e : S}$$

# Proving constant-resource



- Based on the existing type system using potential method (potential encoded in program state to 'pay' resource consumption)
- If final potential is zero then initial potential gives the constant-resource usage

# Evaluation

Constant Function	LOC	Metric	Resource Usage	Time
$\text{cond\_rev} : (L(\text{int}), L(\text{int}), \text{bool}) \rightarrow \text{unit}$	20	steps	$13n+13x+35$	0.03s
$\text{trunc\_rev} : (L(\text{int}), \text{int}) \rightarrow L(\text{int})$	28	function calls	$1n$	0.06s
$\text{ipquery} : L(\text{logline}) \rightarrow (L(\text{int}), L(\text{int}))$	86	steps	$86n+99$	0.86s
$\text{kmeans} : L(\text{float}, \text{float}) \rightarrow L(\text{float}, \text{float})$	170	steps	$1246n+3784$	8.18s
$\text{tea\_enc} : (L(\text{int}), L(\text{int}), \text{nat}) \rightarrow L(\text{int})$	306	ticks	$128n^2z+32nxxz+1184nz+96n+128z+96$	13.73s
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## Common primitive functions

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Constant-time block encryption algorithm

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Cost models

# Summary

- Notion of resource-aware noninterference
- Security type system: combination of classic information flow and resource type systems
- Interactive repair procedure
- Implementation of both linear and polynomial resource consumption

## Future work

- Reason about effects of compilation tools and hardware platforms