

Behavioral Type Systems for Program Analysis: A Tutorial

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What's This Talk About?

- ◆ Behavioral type systems for reasoning about precise properties of programs
 - deadlock, resource access protocols, ...
- ◆ From behavioral types to higher-order model checking

Disclaimer:

No new results, not a general survey
(rather, mainly about our own previous work)

Outline

- ◆ **Type-based program analysis: general principles**
- ◆ **Types for pi-calculus**
 - Syntax and desired properties
 - Demonstration of TyPiCal
 - Channel usage types
 - Types for deadlock-freedom
 - Further extensions
- ◆ **Types for resource usage verification**
- ◆ **From behavioral types to higher-order model checking**
- ◆ **Conclusion**

Type-Based Program Analysis?

- ◆ Program analysis formalized in the form of type inference
 - **Types** as abstract properties of a program
 - **Type judgment** as a relation between a program and its abstract properties
 - **Type inference algorithm** as an algorithm for inferring abstract properties of a program

Behavioral type systems as special instances, where:

- temporal properties of programs (e.g. deadlock, resource access order, ...) are of interest
- types are abstract programs

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Syntax of π -calculus

P, Q (Processes) ::=

0 (inaction)

$\text{new } x \text{ in } P$ (channel creation)

$x!v.P$ (output)

$x?y.P$ (input)

$P|Q$ (parallel execution)

$\text{if } b \text{ then } P \text{ else } Q$ (conditional)

$*P$ (replication)

$x!v.P \mid x?y.Q \rightarrow P \mid [v/y]Q$

(c.f. $(\lambda x.M)N \rightarrow [N/x]M$)

Example: Function Server

Server: $*succ?[n, r].r![n+1]$

Client: $new\ r\ in\ (succ![1, r] \mid r? [x].\dots)$

$*succ?[n, r].r![n+1] \mid succ![1, rep] \mid rep?[m].print![m]$
server client

$\rightarrow *succ?[n, r].r![n+1] \mid rep![2] \mid rep?[m].print![m]$

$\rightarrow *succ?[n, r].r![n+1] \mid print![2]$

Example: Lock

◆ Unlocked state = presence of a value

Locked state = lack of a value

- lock creation: new lock in (lock![] | ...)
- lock acquisition: lock?[]....
- lock release: lock![]

lock![] | lock?[].⟨CS1⟩.lock![] | lock?[].⟨CS2⟩.lock![]



→ lock?[].⟨CS1⟩.lock![] | ⟨CS2⟩.lock![]

→ lock?[].⟨CS1⟩.lock![] | lock![]



→⟨CS1⟩.lock![]

→lock![]

Desired Properties

- ◆ A server is always listening to clients' requests.
- ◆ A server will eventually send a reply for each request.
 - *ping?[r].if b then  r![1] else r![2]
 - *ping?[r].if b then  0 else r![1]
- ◆ A process can eventually acquire a lock.
- ◆ An acquired lock will be eventually released.

Desired Properties

- ◆ A server is always listening to clients' requests.
- ◆ A server will eventually send a reply for each request.
 - *ping?[r].if b then  r![1] else r![2]
 - *ping?[r].if b then  0 else r![1]
- ▲ A process can eventually acquire a

Certain communications should eventually succeed.

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TypiCal [K. 2004]

◆ Deadlock-freedom analysis

- find communications that will eventually succeed unless the process diverges

Input:

if b then x!1 else O | x?n.print!n

Output of analysis:

if b then x!1 else O | x?n.print!n

Will succeed
(if it is executed)

May not succeed

Typical

- ◆ **Deadlock-freedom analysis**
 - find communications that will eventually succeed unless the process diverges
- ◆ **Lock-freedom analysis**
 - find communications that will eventually succeed (even in the presence of divergence)
- ◆ **Termination analysis**
- ◆ **Information flow analysis**
- ◆ **Useless-code elimination**

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 - **Simple Types**
 - Channel usage types
 - Types for deadlock-freedom
 - CCS types
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Simple Channel Types

(cf. CML, Milner's sorting)

τ chan the type of a channel used for sending/receiving a value of type τ

*ping?[r:int chan].r!~~["abc"]~~

*ping?[r:int chan].r!~~[1]~~

*ping?[r:int chan].if b then 0 else ~~r!~~[1]

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Channel Types with Usages

τ `chan(U)` the type of a channel used for sending/receiving a value of type τ according to usage U

*`ping?[r:int chan(!)].r!`["abc"] 

*`ping?[r:int chan(!)].r!`[1] 

*`ping?[r:int chan(!)].if b then` 0  `else r!`[1]

Should be used
once for output

Channel Usage

| | |
|----------------|-------------------------------------|
| $U ::= 0$ | not used |
| $?U$ | used for input, and then as U |
| $!U$ | used for output, and then as U |
| $U_1 \mid U_2$ | used as U_1 and U_2 in parallel |
| $U_1 \& U_2$ | used as U_1 or U_2 |
| $\mu a.U$ | recursion |
| $*U$ | used as U arbitrarily many times |
| a | variable |

Channel Usage: Example

Server-client connection:

$\mu a.(?.a) \mid *!$

Server must be always listening to requests

Client can send requests arbitrarily many times

Reply channel:

$! \mid ?$

Lock channel:

$! \mid *?.!$

Lock is released first

Lock should be released each time it is acquired

Example: Lock

Should be used
as a lock channel

```
newLock?[lock:unit chan(*?.!)].  
lock?[ ]. <CS>.lock![ ] ✓
```

```
newLock?[lock:unit chan(*?.!)].  
lock?[ ]. <CS>.if b then 0 else lock![ ] ✗
```

```
newLock?[lock: unit chan(*?.!) ].  
lock?[ ]. <CS>.(lock![ ] ✗ lock![ ] )
```

Type Judgment

$x_1: \tau_1, \dots, x_n: \tau_n \vdash P$

P uses each x_i according to τ_i

Example:

✓ $x:\text{Int Chan}(!) \vdash x![1]$

✗ $x:\text{Int Chan}(!), b:\text{bool} \vdash$
if b then $x![1]$ else 0

✓ $\text{ping}: (\text{Int Chan}(!)) \text{Chan}(?) \vdash \text{ping}?[r].r![1]$

Typing Rules

$$\Gamma, \gamma:\tau, x:\text{Chan}(\tau, U) \vdash P$$

$$\Gamma, x:\text{Chan}(\tau, ?U) \vdash x?[y].P$$
$$\Gamma \vdash P$$
$$\Delta \vdash Q$$

$$\Gamma \mid \Delta \vdash P \mid Q$$

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Deadlock and Channel Usage

- ◆ Channel usage is useful for finding a possibility of deadlock

if b then x!1 else 0 | x?n.print!n

x's usage: (!&0) | ?

⇒ The input on x may not succeed

- ◆ Channel usage is not sufficient for concluding the absence of deadlock

x?n.y!n | y?m.x!m

x and y's usages are !|?

but the inputs on x and y never succeed!

⇒ Capability/obligation levels

Types for deadlock-freedom: Key Ideas

◆ Channel Usage

- captures **channel-wise** communication behavior (mode/linearity/causality)
 - For each input action, is there a corresponding output action?

◆ **Capability/Obligation Levels**

- capture **inter-channel causality information**
 - Is there any cyclic dependency that causes a deadlock?

Capability/Obligation

[Sumii& Kobayashi HLCL98]

- ◆ **Capability** (to successfully complete an action)
- ◆ **Obligation** (to offer an action)

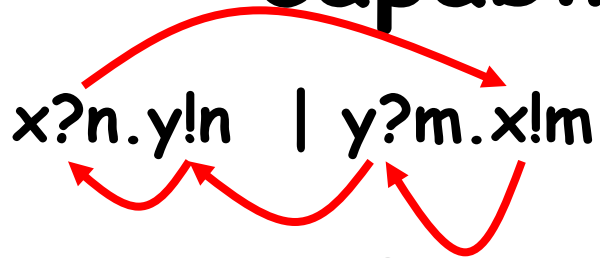
Example: server-client

- Server has an **obligation** to receive a request, and send a reply back to the client.
- Client has a **capability** to send a request, and receive a reply.

Example: lock

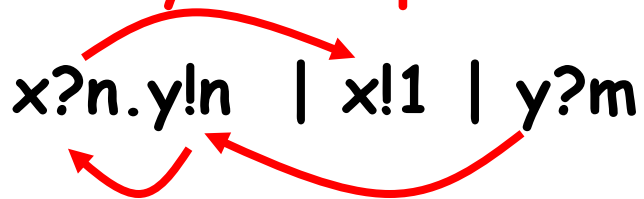
- A process has a **capability** to acquire a lock.
- The process then has an **obligation** to release the lock.

Dependencies between capabilities/obligations



Capability on $y?$ depends on obligation on $y!$
Obligation on $y!$ depends on capability on $x?$
Capability on $x?$ depends on obligation on $x!$
Obligation on $x!$ depends on capability on $y?$

Cyclic dependency on capabilities and obligations!



Capability on $y?$ depends on obligation on $y!$
Obligation on $y!$ depends on capability on $x?$
Capability on $x?$ depends on obligation on $x!$

No cyclic dependency

Capability/Obligation Levels

◆ Associated with usages

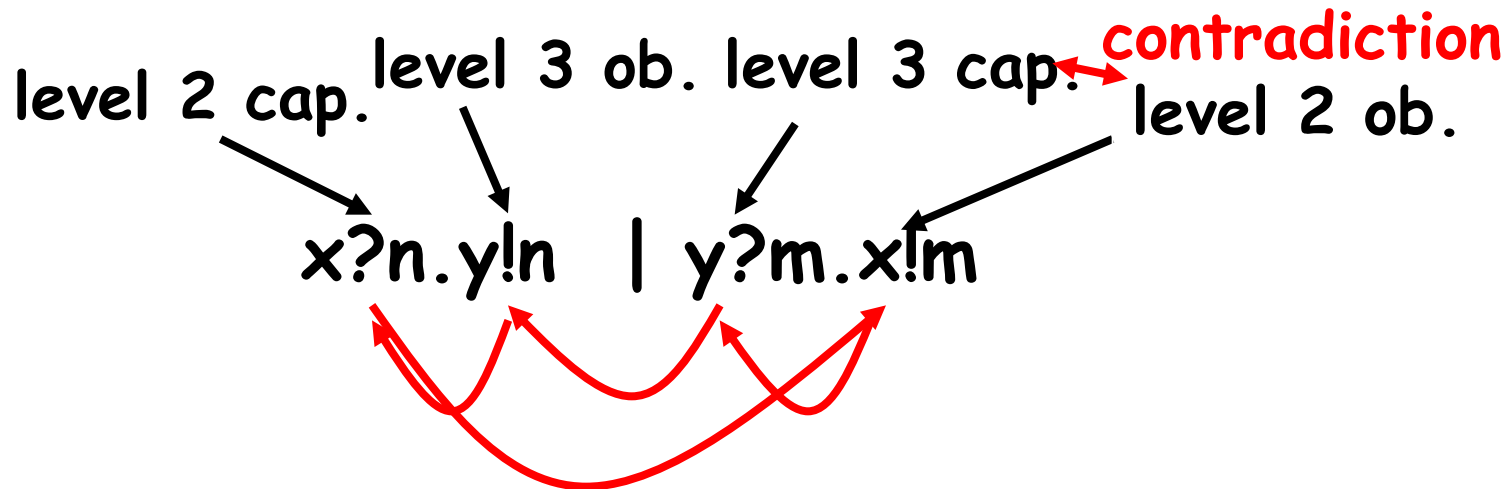
$$U ::= ?(\mathbf{o}, \mathbf{c}).U \mid !(\mathbf{o}, \mathbf{c}).U \mid \dots$$
$$\mathbf{o}, \mathbf{c} ::= 0 \mid 1 \mid 2 \mid \dots \mid \infty$$

absence of
capability/obligation

◆ Prevent cyclic dependency between capabilities/obligations

- An obligation must be fulfilled by using only capabilities of **lower level**
- A capability must be matched by a corresponding obligation of **the same level** (for the co-action)

Examples revisited



No way to assign finite level capabilities to x? and y?

- An obligation must be fulfilled by using only capabilities of lower levels
- If a process has a capability for an action, the environment has an obligation of the same level for the co-action

Typing Rules for Deadlock-Freedom

$$\Gamma, y: \tau, x: \tau \text{ chan}(U) \vdash P$$

$$x: \tau \text{ chan}(?(0, c).U), \uparrow^{c+1}\Gamma \vdash x?^c y.P$$
$$\uparrow^{c+1} (z: \sigma \text{ chan}(! (o_2, c_2).U))$$
$$=$$
$$z: \sigma \text{ chan}(! (\max(c+1, o_2), c_2).U)$$

Typing Rules for Deadlock-Freedom

$$\Gamma, y: \tau, x: \tau \text{chan}(U) \vdash P$$

$$x: \tau \text{chan}(?(0,c).U), \uparrow^{c+1} \Gamma \vdash x?^c_y.P$$
$$\Gamma, x: \tau \text{chan}(U) \vdash P$$

$$x: \tau \text{chan}(! (0,c).U), \uparrow^{c+1} (\Gamma | y: \tau) \vdash x!^c_y.P$$
$$\Gamma \vdash P \quad \Delta \vdash Q$$

$$\Gamma | \Delta \vdash P | Q$$
$$\Gamma, x: \text{chan}(\tau, U) \vdash P$$

U is consistent

$$\Gamma \vdash \text{new } x \text{ in } P$$

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Usage with Varying Argument Types

(cf. session types [Takeuchi, Honda&Kubo, 94])

$\tau ::= b \mid \text{chan}(U)$

$U ::= 0$ not used

$?[\tau].U$ used for receiving a value of type τ ,
and then as U

$![\tau].U$ used for sending a value of type τ ,
and then as U

$U_1 \mid U_2$ used as U_1 and U_2 in parallel

$U_1 \& U_2$ used as U_1 or U_2

$\mu a.U$ recursion

Usage with Varying Argument Types

(cf. session types [Takeuchi, Honda&Kubo, 94])

$\tau ::= b \mid \text{chan}(U)$

$U ::= 0$ not used

$?\tau.U$ used for receiving a value of type τ ,
and then as U

$!\tau.U$ used for sending a value of type τ ,

Example:

```
x: chan(?[bool].![int]) |-  
  x?[b].if b then x![1] else x![2]
```

Typing Rules

$$\Gamma, \gamma:\tau, x:\text{Chan}(U) \vdash P$$

$$\Gamma, x:\text{Chan}([\tau].U) \vdash x?[y].P$$
$$\Gamma, x:\text{Chan}(U) \vdash P$$
$$\tau_1 \leq \tau_2 \text{ if } U \rightarrow^* ![\tau_1].U_1 \mid ?[\tau_2].U_2 \mid U_3$$

$$\Gamma \vdash \text{new } x \text{ in } P$$

Typing Rules

Examples

- a bad usage:

$![\text{int}].![\text{bool}] \mid ?[\text{int}].?[\text{int}]$

- a good usage:

$![\text{int}] \mid *?[\text{int}].![\text{int}]$

$\Gamma, x:\text{Chan}(U) \vdash P$

$\tau_1 \leq \tau_2$ if $U \rightarrow^* ![\tau_1].U_1 \mid ?[\tau_2].U_2 \mid U_3$

$\Gamma \vdash \text{new } x \text{ in } P$

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$?\tau.U$ used for receiving a value of type τ ,
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$!\tau.U$ used for sending a value of type τ ,

Session types

\approx Extended usage + labeled branch

+ restriction on parallel composition

CCS Types

[Igarashi&K. 2001, Chaki et al. 2002]

$\tau ::= b \mid (x_1, \dots, x_n)\Gamma$

$\Gamma ::= 0$ not used

$x?[\tau]. \Gamma$ used for receiving a value of type τ through x , and then as Γ

$x![\tau]. \Gamma$ used for sending a value of type τ through x , and then as Γ

$\Gamma_1 \mid \Gamma_2$ used as Γ_1 and Γ_2 in parallel

$\Gamma_1 \& \Gamma_2$ used as Γ_1 or Γ_2

$\Gamma_1 + \Gamma_2$ (external) choice

$\mu a. \Gamma$ recursion

CCS Types

[Igarashi&K. 2001, Chaki et al. 2002]

$\tau ::= b \mid (x_1, \dots, x_n)\Gamma$

$\Gamma ::= 0$ not used

$x?[\tau]. \Gamma$ used for receiving a value of type τ through x , and then as Γ

$x![\tau]. \Gamma$ used for sending a value of type τ through x and then as Γ

Example:

$x?[bool].y![int] \mid - x?[b].y![1]$

$r?[(x,y)x?[int].y![int]]$
 $\mid - r?[w,z].w?n.z!(n+1)$

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Resource Usage Verification for Functional Programs

[Igarashi&K. POPL02]

Is each resource (files, network, memory, ...) accessed in a valid manner?

```
let f(x) =  
  if * then close(x)  
  else read(x); f(x)  
in  
let y = open "foo"  
in  
  f (y)
```

Is the file "foo"
accessed according
to read* close?

Types

| | | |
|--------------------|-----------------------------|--|
| τ (types) ::= | b | base types |
| | $R(u)$ | resource types |
| | $\tau_1 \rightarrow \tau_2$ | function types |
| | $\tau \times \tau$ | |
| u (usages) ::= | 0 | cannot be used |
| | a | accessed once by use _{a} |
| | $u_1; u_2$ | u_1 and then u_2 |
| | $u_1 \& u_2$ | u_1 or u_2 |
| | ρ | usage variable |
| | $\mu\rho. u$ | recursion |

Examples: usages

◆ $\mu\rho.(c \ \& \ (r; \ \rho))$: read-only file

◆ $\mu\rho.(0 \ \& \ (\text{push};\rho; \ \text{pop}))$: stack

| | | |
|-----|-------------------------|---------------------------------|
| u | $(\text{usages}) ::= 0$ | cannot be used |
| | a | accessed once by use_a |
| | $u_1; u_2$ | u_1 and then u_2 |
| | $u_1 \& u_2$ | u_1 or u_2 |
| | ρ | usage variable |
| | $\mu\rho. u$ | recursion |

Example

```
let f(x: R(r*c)) =  
  if * then close(x)  
  else read(x); f(x)  
in  
let y: R(r*c) = open "foo"  
in  
  f (y)
```

Typing: resources

$$\text{sem}(u) \subseteq \Phi$$

$$\vdash \text{new}^\Phi(): R(u)$$
$$\Gamma \vdash M: R(a)$$

$$\Gamma \vdash \text{use}_a M: \text{unit}$$

Typing : let

$$\frac{\Gamma \vdash M:\tau \quad \Delta, x:\tau \vdash N:\sigma \quad \text{rfree}(\tau)}{\Gamma ; \Delta \vdash \text{let } x=M \text{ in } N : \sigma}$$

($\text{rfree}(\tau)$ if τ does not contain resource types)

Example:

$$\frac{y: R(r) \vdash \text{read}(y):\text{unit} \quad y: R(c), x: \text{unit} \vdash \text{close}(y):\text{unit}}{y: R(r;c) \vdash \text{let } x= \text{read}(y) \text{ in } \text{close}(y) : \text{unit}}$$

Outline

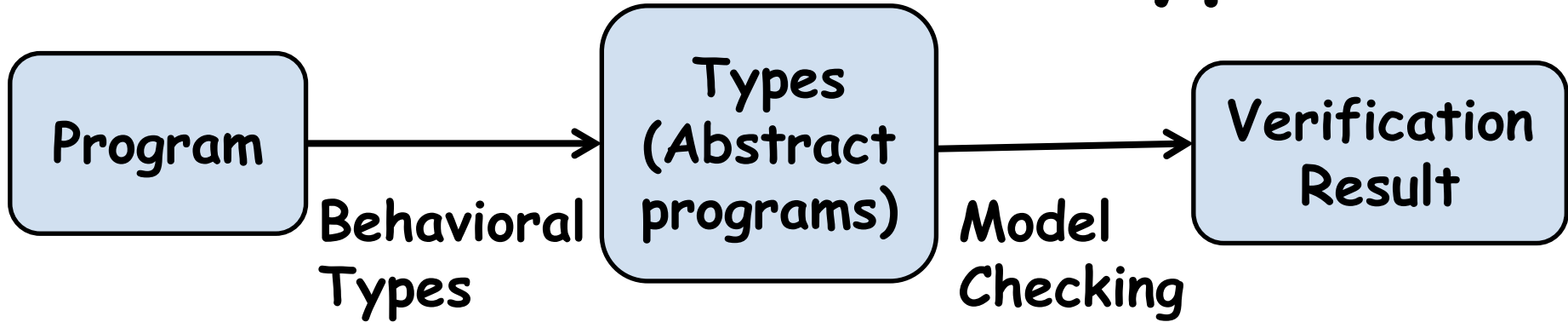
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Behavioral Types for Program Verification

- ◆ **Types** (or type environments)
= abstract models of a program
- ◆ **Typing rules** establish a relation between a program and its abstraction
- ◆ **Type inference** computes an abstraction of a program
- ◆ **Extra work** (possibly **model checking**) is needed to check that the abstraction (hence also the program) satisfies an expected property

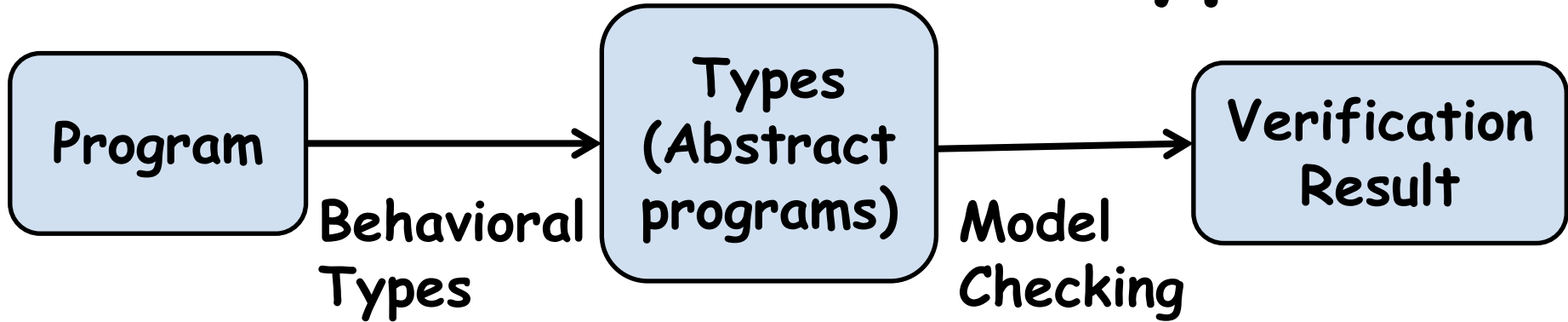
$$\frac{\Gamma, x:\text{Chan}(U) \vdash P \quad \tau_1 \leq \tau_2 \text{ whenever } U \rightarrow^* ![\tau_1].U_1 \mid ?[\tau_2].U_2 \mid U_3}{\Gamma \vdash \text{new } x \text{ in } P}$$

Role of Behavioral Types?



1. Map a program to a **simpler** model (e.g. CCS instead of π -calculus, first-order programs instead of higher-order ones)
2. Project the whole program behavior to each behavior of interest

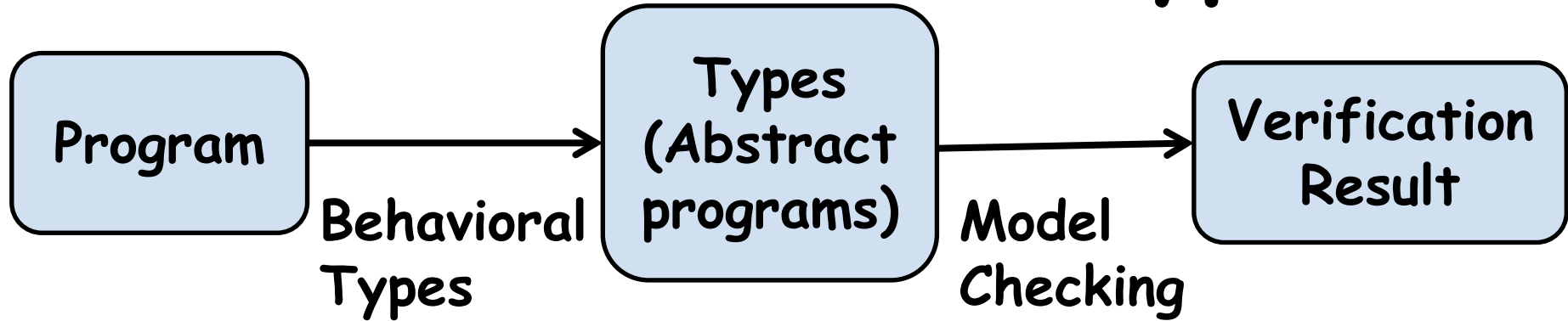
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Is it essential to use *first-order* programs as abstract programs?

Role of Behavioral Types?



1. Map a program to a **simpler** model (e.g. CCS instead of π -calculus, first-order programs instead of higher-order ones)

Is it essential to use *first-order* programs as abstract programs?

No. (cf. Model checking of higher-order recursion schemes [Ong 2006])

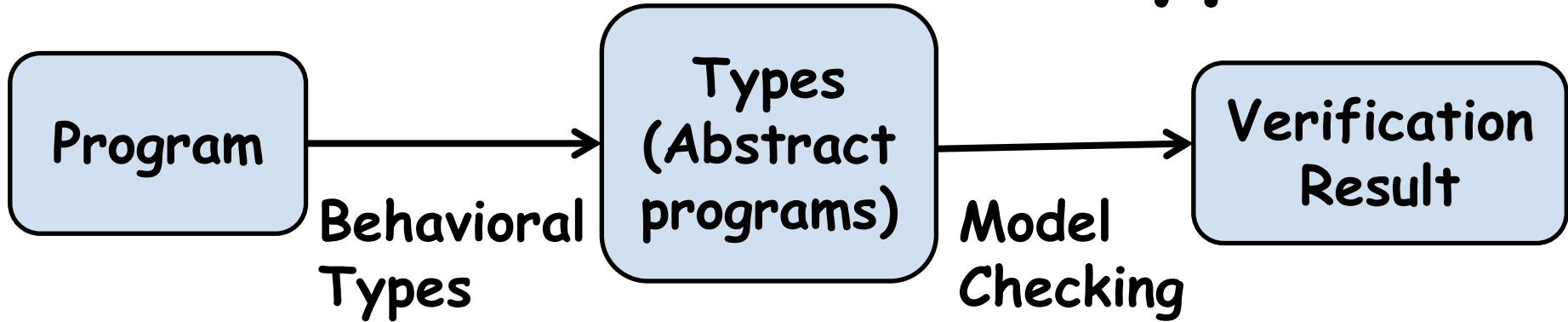
Higher-order programs as abstractions

```
let f(x, y) =  
  if * then  
    close(x); close(y)  
  else  
    read(x); write(y);  
    f(x, y)  
in  
  let x = newr*c() in  
  let y = neww*c() in  
    f(x, y)
```

```
let f(x) =  
  if * then close(x)  
  else read(x); f(x) in  
  let x = newr*c() in  
    f(x)
```

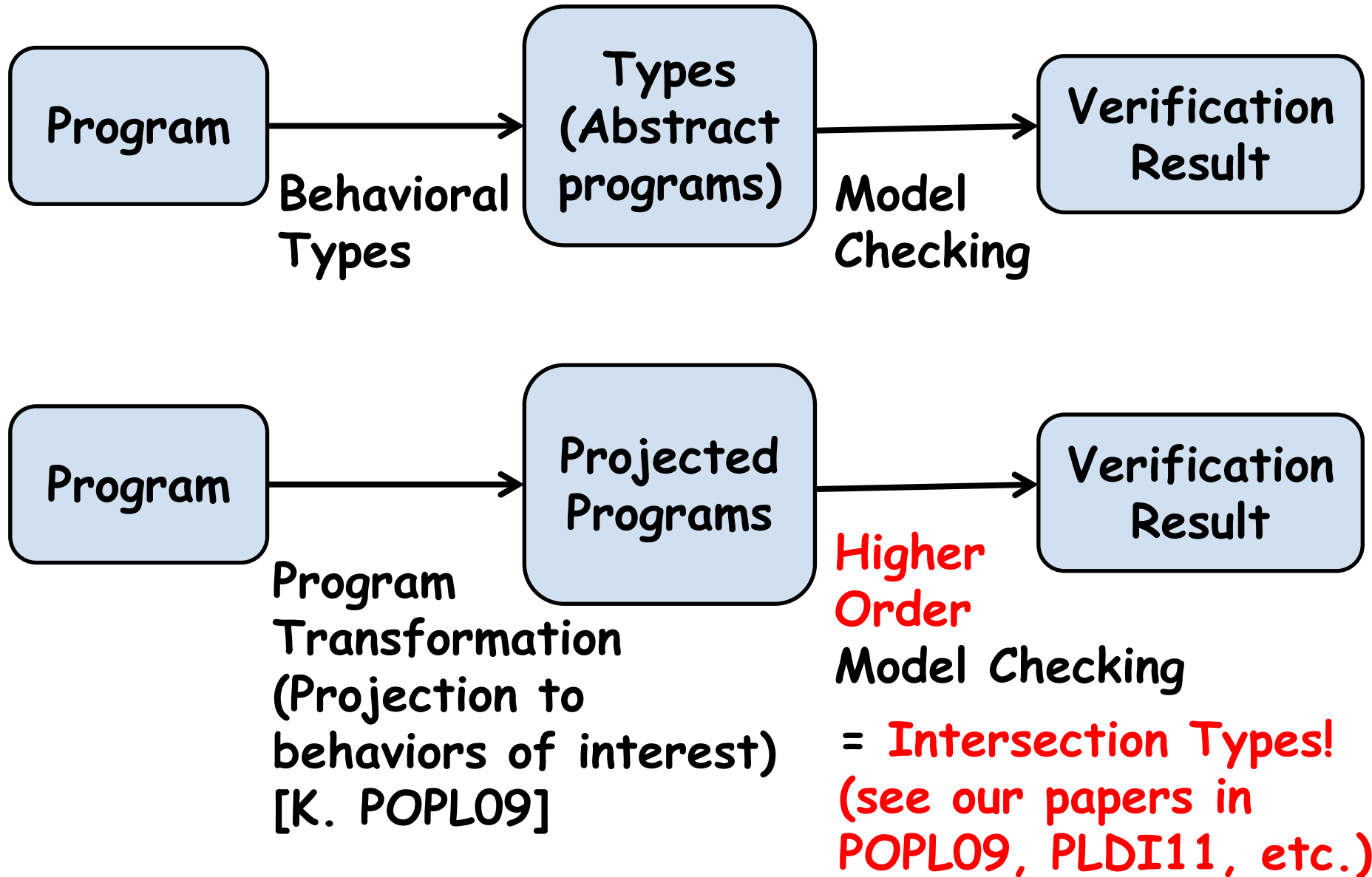
```
let f(y) =  
  if * then close(y)  
  else write(y); f(y) in  
  let y = neww*c() in  
    f(y)
```

Role of Behavioral Types?



1. Map a program to a simpler model (e.g. CCS instead of π -calculus, first-order programs instead of higher-order ones)
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Behavioral Types to HO Model Checking



Conclusion

- ◆ Tutorial on behavioral types for
 - channel usage
 - deadlock
 - resource access protocols
- ◆ From behavioral types to HO model checking