

Hybrid Partial Evaluation OOPSLA'11 (best student paper)

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About me

PhD Brown University, 1989 w/Peter Wegner

Denotational Semantics of Inheritance

Mixins, F-Bounds, Class reorganization, ADT/OOP

AppleScript

Lead designer and group manager

Allegis: Indirect Sales Chain Management

Founder, VP Engineering CTO (1997-2003)

150 employees, \$60M in venture capital

Customers: Microsoft, HP, Charles Schwab, etc.

University of Texas at Austin, Computer Science

Joined 2003

Motivation

Goal

We want to write *general* programs/libraries
But use them in *specific situations*

Partial Evaluation

Can *specialize* a general program to some inputs

Desires

Easy to understand

Easy to implement

Works well in practice

Partial Evaluation (by hand)

Example: Power function

$\text{pow}(n, x) = \text{if } (n==0) \text{ then } 1 \text{ else } x * \text{pow}(n-1, x)$

What if you know n ?

$\text{pow}(3, x) = x * \text{pow}(2, x)$

if (3==0) then 1
else x*pow(3-1, x)

This depends on $\text{pow}(2, x)$

$\text{pow}(2, x) = x * \text{pow}(1, x)$

$\text{pow}(1, x) = x * \text{pow}(0, x)$

$\text{pow}(0, x) = 1$

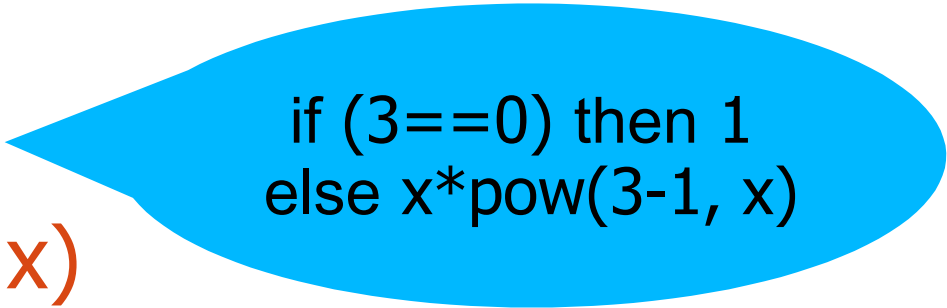
Partial Evaluation (by hand)

Example: Power function

$\text{pow}(n, x) = \text{if } (n==0) \text{ then } 1 \text{ else } x * \text{pow}(n-1, x)$

What if you know n ?

$\text{pow3}(x) = x * \text{pow2}(x)$



$\text{if } (3==0) \text{ then } 1 \text{ else } x * \text{pow}(3-1, x)$

This depends on $\text{pow}(2, x)$

$\text{pow2}(x) = x * \text{pow1}(x)$

$\text{pow1}(x) = x * \text{pow0}(x)$

$\text{pow0}(x) = 1$

Partial Evaluation

Example: Power function

$\text{pow}(n, x) = \text{if } (n==0) \text{ then } 1 \text{ else } x * \text{pow}(n-1, x)$

Lets call this final function "pow3":

$\text{pow3}(x) = x * x * x$

Partial evaluation

Eliminates computations that depend on known inputs

Result is "residual program"

Doesn't always work:

$\text{pow}(n, 19) = \text{if } (n==0) \text{ then } 1 \text{ else } 19 * \text{pow}(n-1, 19)$

Useful when raising many numbers to 3rd power

Automatic Partial Evaluation

Example: Power function

$\text{pow}(n, x) = \text{if } (n==0) \text{ then } 1 \text{ else } x * \text{pow}(n-1, x)$

Can we compute residual code automatically?

$\text{peval}(\text{pow}, 3) \rightarrow \text{fun}(x) \ x * x * x \equiv \text{pow}3$

Partial evaluation function: `peval`

Inputs:

Source code of a function

Value of the first argument

Output:

Residual code from partially evaluating

Automatic Partial Evaluation

Example: Power function

$\text{pow}(n, x) = \text{if } (n==0) \text{ then } 1 \text{ else } x * \text{pow}(n-1, x)$

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Partial evaluation function: `peval`

Inputs:

Source code of a function

Value of the first argument

Output:

Residual code from partially evaluating

Example

```
String pat = CT("(a(*|*)b)*(abb(*|*)a+b)")  
Regex regex = CT(RegexParser.parse(pat));
```

```
String buffer = in.readLine(...)
```

```
regex.execute(buffer);
```

Pure 1st-order Functional Language

x : Variable v : Value

$e = x \mid v \mid \mathbf{if} \ e \ \mathbf{then} \ e \ \mathbf{else} \ e \mid e+e \mid \mathbf{f} (e, \dots, e)$

ρ environment maps *all* variables to values

$$\mathbf{E}[v]\rho = v$$

$$\mathbf{E}[x]\rho = \rho(x)$$

$$\mathbf{E}[\mathbf{if} \ e_1 \ \mathbf{then} \ e_2 \ \mathbf{else} \ e_3]\rho = \mathbf{if} \ \mathbf{E}[e_1]\rho \ \mathbf{then} \ \mathbf{E}[e_2]\rho \ \mathbf{else} \ \mathbf{E}[e_3]\rho$$

$$\mathbf{E}[e_1+e_2]\rho = \mathbf{E}[e_1]\rho + \mathbf{E}[e_2]\rho$$

$$\mathbf{E}[\mathbf{f} (e_1, \dots, e_n)]\rho = \mathbf{E}[e]\rho'$$

lookup function definition: $\mathbf{f} (x_1, \dots, x_n) = e$

$$\rho' = \{ x_1 = \mathbf{E}[e_1]\rho, \dots, x_n = \mathbf{E}[e_n]\rho \}$$

Evaluation to Partial Evaluation

The type of eval

$E : \text{Expression} \rightarrow \text{Environment} \rightarrow \text{Value}$

$\text{Environment} = \text{Variable} \rightarrow \text{Value}$

$\text{FreeVars}(e) \subseteq \text{Domain}(v)$

All variables are bound

What about a partial evaluator?

Environment gives values to some variables

$P : \text{Expression} \rightarrow \text{Environment} \rightarrow \text{Expression}$

Result might not be a complete value

$P[x+y] \{x=3, y=2\} \rightarrow 5$

$P[x+y] \{x=3\} \rightarrow [3+y]$

Online Partial Evaluator P

x : Variable v : Value

$e = x \mid v \mid \mathbf{if} \ e \ \mathbf{then} \ e \ \mathbf{else} \ e \mid e+e \mid f(e, \dots, e)$

environment maps *some* variables to values

$P[v]\rho = v$

$P[x]\rho = \mathbf{if} \ x \in \text{dom}(\rho) \ \mathbf{then} \ \rho(x) \ \mathbf{else} \ [x]$

returns code $[x]$ if the variable is not defined

Online Partial Evaluator P

x : Variable v : Value

$e = x \mid v \mid \mathbf{if} \ e \ \mathbf{then} \ e \ \mathbf{else} \ e \mid e+e \mid f(e, \dots, e)$

environment maps *some* variables to values

$P[v]\rho = v$

$P[x]\rho = \mathbf{if} \ x \in \text{dom}(\rho) \ \mathbf{then} \ \rho(x) \ \mathbf{else} \ \langle\langle x \rangle\rangle$

$P[\mathbf{if} \ e_1 \ \mathbf{then} \ e_2 \ \mathbf{else} \ e_3]\rho =$

case $P[e_1]\rho$ **of**

$v \rightarrow \mathbf{if} \ v \ \mathbf{then} \ P[e_2]\rho \ \mathbf{else} \ P[e_3]\rho$

$e \rightarrow \langle\langle \mathbf{if} \ e \ \mathbf{then} \ P[e_2]\rho \ \mathbf{else} \ P[e_3]\rho \rangle\rangle$

if its a boolean v , then pick branch.

else create a new if statement

Online Partial Evaluator P

$$P[v]\rho = v$$

$$P[x]\rho = \mathbf{if } x \in \text{dom}(\rho) \mathbf{ then } \rho(x) \mathbf{ else } \langle\langle x \rangle\rangle$$

$$P[\mathbf{if } e_1 \mathbf{ then } e_2 \mathbf{ else } e_3]\rho =$$

case $P[e_1]\rho$ **of**

$$v \rightarrow \mathbf{if } v \mathbf{ then } P[e_2]\rho \mathbf{ else } P[e_3]\rho$$

$$e \rightarrow \langle\langle \mathbf{if } e \mathbf{ then } P[e_2]\rho \mathbf{ else } P[e_3]\rho \rangle\rangle$$

$$P[e_1+e_2]\rho =$$

$$v_1 + v_2 \quad \mathbf{if } v_i = P[e_i]\rho$$

$$\langle\langle e'_1+e'_2 \rangle\rangle \quad \mathbf{if } e'_i = P[e_i]\rho$$

apply operator if arguments are both are values
otherwise generate new expression

Function Calls

$$P[\mathfrak{f}(e_1, \dots, e_n)]\rho = \langle\langle \mathfrak{f}_{\rho_s}(e'_{d_1}, \dots, e'_{d_k}) \rangle\rangle$$

1. lookup function definition: $\mathfrak{f}(x_1, \dots, x_n) = e$
2. Partially evaluate the arguments
 $e'_i = P[e_i]$
3. partition arguments into “compile time (CT)” and “runtime”
 $\{s_1, \dots, s_j\} \cup \{d_1, \dots, d_k\} = \{1, \dots, n\}$
 $\forall \{e'_{s_1}, \dots, e'_{s_j}\} = \{v_1, \dots, v_j\}$
4. create environment with CT variables
 $\rho_s = \{x_{s_1} = v_{s_1}, \dots, x_{s_j} = v_{s_j}\}$
5. create new function specialized by CT values
 $\mathfrak{f}_{\rho_s}(x_{d_1}, \dots, x_{d_k}) = E[e] \rho_s$
6. Residual code is call with runtime arguments
 $\langle\langle \mathfrak{f}_{\rho_s}(e'_{d_1}, \dots, e'_{d_k}) \rangle\rangle$

Hybrid Partial Evaluation

Online style (no static analysis)

Annotations to begin partial evaluation

No termination guarantee

Object-oriented language

- Imperative (mutable state)

- Objects “live” at compile-time or runtime (not both)

- Specialize methods and classes

Formalized in Haskell (It's fun, check it out!)

Real compiler for Java (Part of Batches project)

Partial Evaluation Annotations

Two *stages*:

Compile-time: pre execution during partial evaluation/compilation

Runtime: normal execution

Annotation

CT(e)

Marks expression e for execution at compile time

Example

```
Regex regex = CT(Regex.parse("(a|b)*"));  
regex.execute(buffer);
```

Objects

Any object can be instantiated at compile time

if (config.loggingEnabled) ...

dead code elimination

if (config.enabled("logging")) ...

dead code elimination

if (config.enabled(userInput)) ...

inlines "enabled" method using config state

x = new System(config1);

y = new System(config2);

specializes System class, once for each config!

dynamicHashMap.put("c1", config)

compile-time error: Config cannot jump to runtime

Objects exists in exactly one stage

Cannot move
(from compile time to runtime)

Primitive values can move

Mutable State

Mutable state

Supported!

A mutable object is either compile-time or runtime

Within stage, all mutations happen in correct order

```
Regex regex = CT(Regex.parse("(a|b)*"));  
regex.execute(buffer);
```

Behavior maybe different with/without PE

Annotated program may have different behavior

e.g. Print statements may happen at compile time

Program may be rejected (if statements)

Annotations create a *new language*

Reflection

Reflection becomes static

```
String name = CT("getSize");
```

```
Method m = o.getClass().getMethod(name);
```

```
m.invoke(o);
```

converts to:

```
o.getSize();
```

Termination

No Termination Guarantee

The compiler may diverge

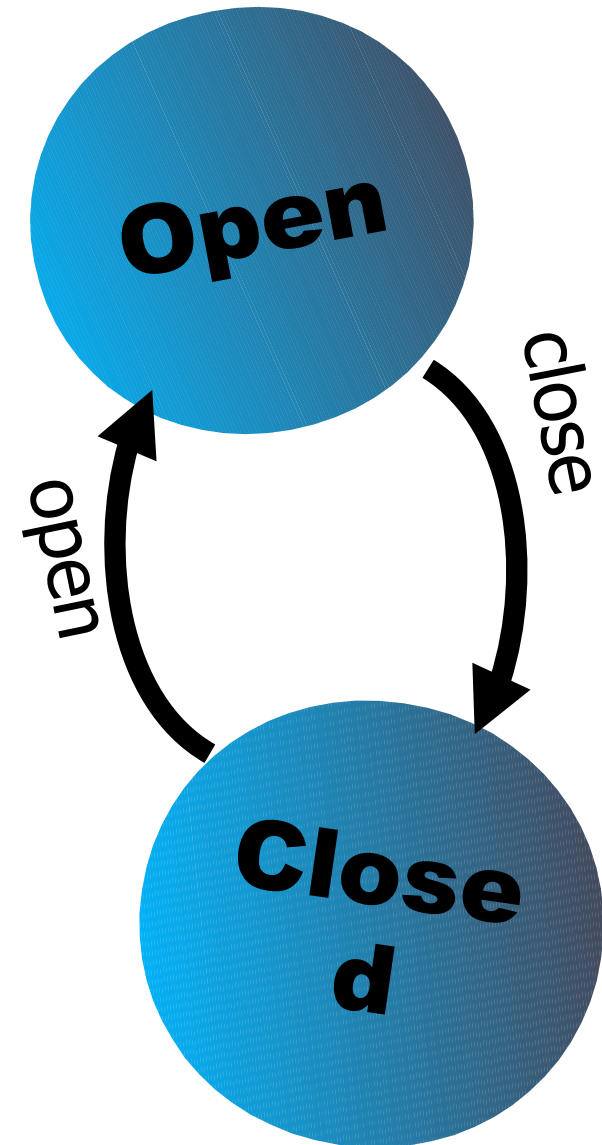
This is true of C++ compiler

Hit Ctrl-C and modify the program....

Example Model Interpreter

Interpreter

```
int run(State current) {  
    print(current.label);  
    String input = in.readLine();  
    nxt = current.trans.lookup(input);  
    run(nxt);  
}
```



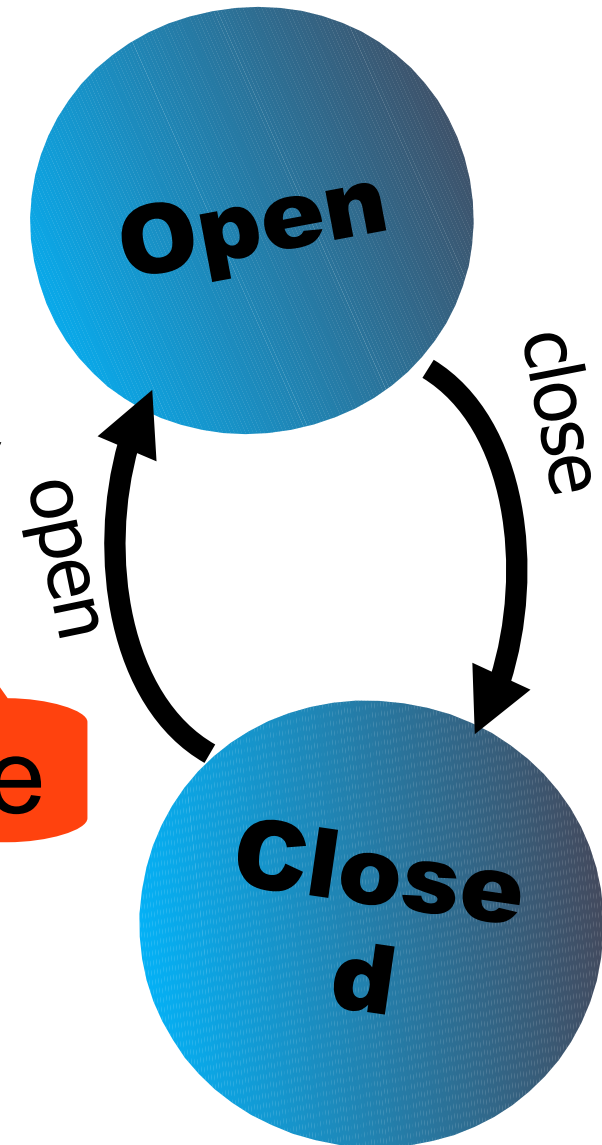
Example Model Interpreter

Interpreter

```
int run(State current) {  
    print(current.label);  
    String input = in.readLine();  
    nxt = current.trans.lookup(input);  
    run(nxt);  
}
```

compile
time

Runtime

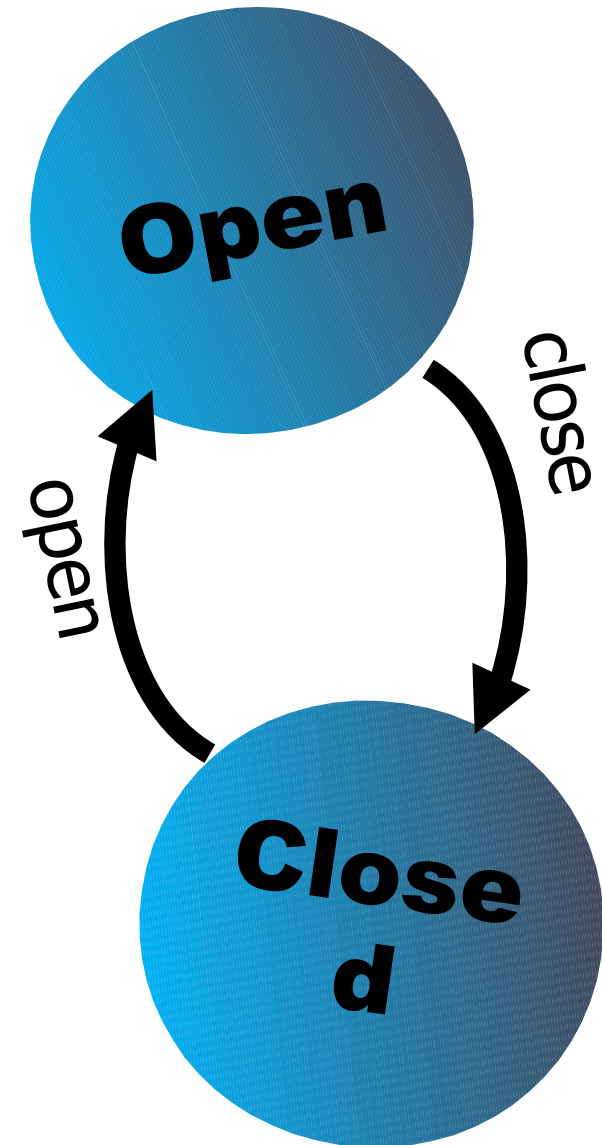


“The Trick”

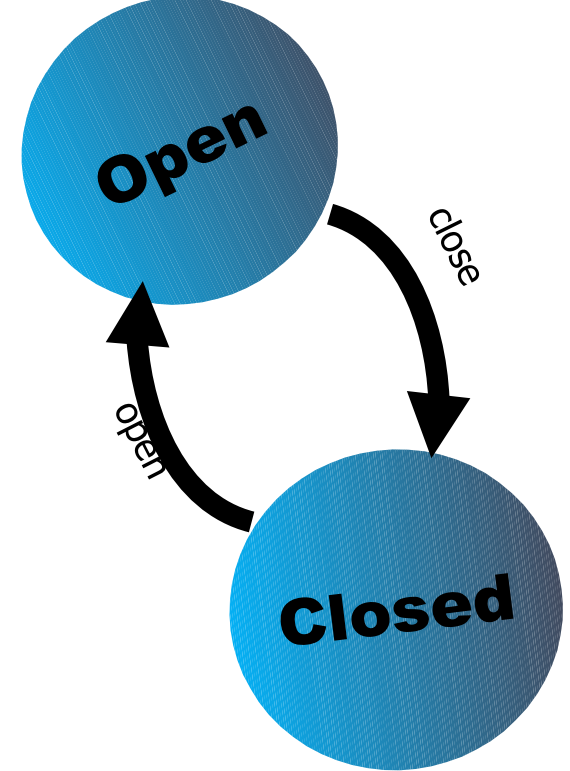
(Binding-time improvement)

Interpreter

```
int run(State current) {  
    print(current.label);  
    String input = in.readLine();  
    for (Trans t : current.trans)  
        if (t.event == input)  
            return run(t.to);  
    return run(current);  
}
```



Partial Evaluation



```
int runOpen() {  
    print("Open");  
    String input = in.readLine();  
    if ("close" == input)  
        return runClosed();  
    return runOpen();  
}
```

```
int runClosed() {  
    print("Closed");  
    String input = in.readLine();  
    if ("open" == input)  
        return runOpen();  
    return runClosed();  
}
```

```
int run(State current) {  
    print(current.label);  
    String input = in.readLine();  
    for (Trans t : current.trans)  
        if (t.event == input)  
            return run(t.to);  
    return run(current);  
}
```

Goal: Partial Evaluation of WebDSL

`web(UI, Schema, db, request) : HTML`

UI : description of user interface (pages, sections)

schema: description of data (constraints, etc)

db : data store (described by schema)

request : an HTTP request

web : interpreter, with design knowledge

Partial Evaluation

$\text{web}_{[\text{UI}, \text{Schema}]}$ (db, request) : HTML
compiletime runtime

$\text{web}_{[\text{UI}, \text{Schema}]}$ is partial evaluation of web with respect to UI model and data schema

Supports both dynamic interpretation and compiled execution in same framework

Civet: A Partial Evaluator for Java



Civet: A Partial Evaluator for Java

Usable but not complete

Implemented as extension to javac

Testing on Real Applications

ModelTalk -- dynamic pricing application
more?

Initial results for ModelTalk (3rd party test)

Original: 3,153 ms

Optimized: 293 ms

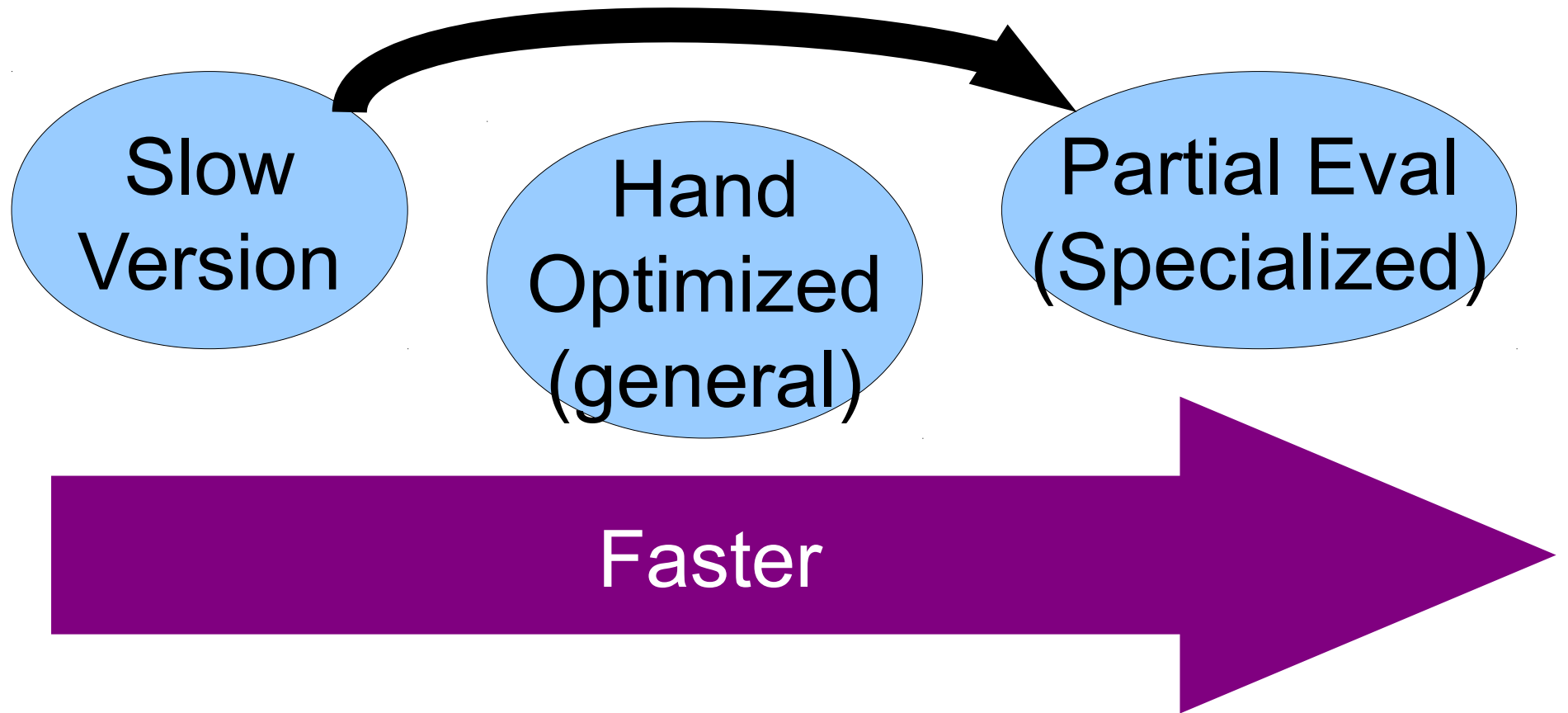


Performance of RegEx example

Uses Derivative-based interpreter for regular expressions

Program	Time (ms)
Original regex state machine	1189
Specialized regex state machine	573
dk.brics.automaton regex library	816

Paradox of Performance with Partial Evaluation



Future

Currently AST based transformation

Should move to byte-code partial evaluation

Conclusion

Hybrid Partial Evaluation

Online strategy

Offline power

Practicalities

Annotations to begin partial evaluation

No termination guarantee

Compile-time structures are never residualized

Imperative effects within each stage

Programmers must be aware of “the trick”

No self-application (First Futamura projection only)

Futamura (1971)

Partial evaluation
of an interpreter
with respect to a program
is a
compiled version
of the program

Partial Evaluation of Interpreters

Interpreter

```
python("notify.pl", "in.txt") → o
```

Futamura Projections I

Interpreter

`python("notify.pl", "in.txt")` \rightarrow `o`

First Futamura projection

`peval(python, "notify.pl")` \rightarrow `g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Futamura Projections (pattern)

Interpreter

`python("notify.pl", "in.txt")` \rightarrow `o`

First Futamura projection

`peval(python, "notify.pl")` \rightarrow `g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Futamura Projections II

Interpreter

`python("notify.pl", "in.txt")` \rightarrow `o`

First Futamura projection

`peval(python, "notify.pl")` \rightarrow `g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Second Futamura projection

`peval(peval, python)` \rightarrow `c` where `c("notify.pl") = g`

`c` is a python compiler

Futamura Projections III

Interpreter

`python("notify.pl", "in.txt")` \rightarrow `o`

First Futamura projection

`peval(python, "notify.pl")` \rightarrow `g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Second Futamura projection

`peval(peval, python)` \rightarrow `c` where `c("notify.pl") = g`

`c` is a python compiler

Third Futamura projection

`peval(peval, peval)` \rightarrow `z` where `z(python) = c`

`z` is a compiler compiler!

We only need First Projection

Interpreter

`python("notify.pl", "in.txt") → o`

First Futamura projection

`peval(python, "notify.pl") → g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Second Futamura projection

`peval(peval, python) → c` where `c("notify.pl") = g`

`c` is a python compiler

Third Futamura projection

`peval(peval, peval) → z` where `z(python) = c`

`z` is a compiler compiler!

Avoid Need for Self-Applicable peval

Interpreter

`python("notify.pl", "in.txt")` \rightarrow `o`

First Futamura projection

`peval(python, "notify.pl")` \rightarrow `g` where `g("in.txt") = o`

`g` is compiled version of `notify.pl`

Second Futamura projection

`peval(peval, python)` \rightarrow `c` where `c("notify.pl") = g`

`c` is a python compiler

Third Futamura projection

`peval(peval, peval)` \rightarrow `z` where `z(python) = c`

`z` is a compiler compiler!

Futamura in Practice

Interpreters have “good” behavior

Control flow depends on program first, then input
just like `pow(n, x)`: control flow depends on `n`

Can't make good compilers via 2nd/3rd Futamura

Trying to make a C compiler via Futamura will fail
Was that the right goal?

Be careful what you pick as challenge problem

Hypothesis:

First Futamura projection will work well enough for
model interpreters

solves real problem, simple partial evaluator