### MEASURING RETICULATED PYTHON

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ACCEP

DENIAL

GRIFF

BARGAÎ NÎNG

DEPRES

ANGER

#### Reticulated Python

- Gradual typing for Python [DLS 2014]
- Static type checking
- Dynamic type enforcement
- Formal model is type is sound [POPL 2017]

#### **Example Program**

```
def f(n):
    return n*(n+1) // 2

def get_numbers(count):
    nums = []
    for i in range(1, 1+count):
        nums.append(f(i))
    return nums

get_numbers(4)
# [1, 3, 6, 10]
```

#### Example Program, Fully-Typed

```
def f(n:Int)->Int:
    return n*(n+1) // 2

def get_numbers(count:Int)->List(Int):
    nums = []
    for i in range(1, 1+count):
        nums.append(f(i))
    return nums

get_numbers(4)
# [1, 3, 6, 10]
```

#### Example Program, Partially Typed

```
def f(n:Int):
    return n*(n+1) // 2

def get_numbers(count)->List(Int):
    nums = []
    for i in range(1, 1+count):
        nums.append(f(i))
    return nums

get_numbers(4)
# [1, 3, 6, 10]
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#### Example Program, Partially Typed

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def f(n:Int):
  return n*(n+1) // 2
def get numbers(count)->List(Int):
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  for i in range(1, 1+count):
    nums.append(f(i))
  return nums
get numbers(4)
# [1, 3, 6, 10]
f("not a number")
# Static type error
```

#### Example Program, Partially Typed

```
def f(n:Int):
  return n*(n+1) // 2
def get numbers(count)->List(Int):
  nums = []
  for i in range(1, 1+count):
    nums.append(f(i))
  return nums
get numbers(4)
# [1, 3, 6, 10]
f("not a number")
# Static type error
get numbers("not a number")
# Dynamic type error
```

#### Reticulated Python

- Gradual typing for Python [DLS 2014]
- Static type checking
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## STAGE I: GRIEF

```
def f(n:Int):
    return n*(n+1) // 2

def get_numbers(count)->List(Int):
    nums = []
    for i in range(1, 1+count):
        nums.append(f(i))
    return nums

get_numbers(4)
```

```
def f(n:Int):
    return n*(n+1) // 2

def get_numbers(count)->List(Int):
    nums = []
    for i in range(1, 1+count):
        nums.append(f) # typo!
    return nums

get_numbers(4)
```

```
def f(n:Int):
  return n*(n+1) // 2
def get numbers(count)->List(Int):
  nums = []
  for i in range(1, 1+count):
    nums.append(f) # typo!
  return nums
get numbers(4)
# [<fun>, <fun>, <fun>, <fun>]
```

```
def f(n:Int):
  return n*(n+1) // 2
def get numbers(count)->List(Int):
  nums = []
  for i in range(1, 1+count):
    nums.append(f) # typo!
  return nums
get numbers(4)
# [<fun>, <fun>, <fun>, <fun>]
def apply first(funs):
  return funs[0](10)
apply first(get numbers(4))
# 55
```

#### **Another Something Weird**

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```
@fields({"dollars": Int
        ,"cents": Int})
class Cash:
  dollars = 0
  cents = 0
  def add dollars(self, dollars):
    self.dollars += dollars
def get cash()->Cash:
  c = Cash()
  c.add dollars (3.14159)
  return c
get cash()
# Cash(3.14159, 0)
```

## STAGE II: DENIAL

#### Type Soundness

If e has type **T**, then either:

- e reduces to a value v with type T
- e raises an error due to a partial primitive
- e diverges

#### Reticulated Type Soundness

If e has type **T**, then either:

• e reduces to a value v with type T

- e raises a blame error
- e diverges

#### **Big Types in Little Runtime**

Open-World Soundness and Collaborative Blame for Gradual Type Systems

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#### Abstract

Gradual typing combines static and dynamic typing in the same language, offering programmers the error detection and strong guarantees of static types and the rapid prototyping and flexible programming idioms of dynamic types. Many gradually typed languages are implemented by translation into an untyped target language (e.g., Typed Clojure, TypeScript, Gradualtalk, and Reticulated Python). For such languages, it is desirable to sup-

typed code interacts: the consistency relation plays the role that type equality usually does in the type system. Types are consistent if they are equal up to the presence of  $\star$ .

Most existing gradually typed languages operate by translating a surface language program into an underlying target language, which is then executed. For many gradually-typed systems such as Typed Racket and TypeScript, the target language is a dynamically typed programming language, and gradually-typed programs are

**Corollary 5.5.1** (Type soundness). If  $\emptyset \vdash e_s \leadsto e : T$  then  $\emptyset$ ;  $\emptyset \vdash e : \lfloor T \rfloor$  and either:

- $\langle e, \emptyset, \emptyset \rangle \longrightarrow^* \langle v, \sigma, \mathcal{B} \rangle$  and  $\emptyset; \Sigma \vdash v : \lfloor T \rfloor$  and  $\Sigma \vdash \sigma$ , or
- $\langle e, \emptyset, \emptyset \rangle \longrightarrow^* BLAME(\mathcal{L})$ , or
- for all  $\varsigma$  such that  $\langle e, \emptyset, \emptyset \rangle \longrightarrow^* \varsigma$ , have that  $\varsigma = \langle e', \sigma, \mathcal{B} \rangle$  and exists  $\varsigma'$  such that  $\langle e', \sigma, \mathcal{B} \rangle \longrightarrow \varsigma'$ .

$$\begin{bmatrix} T \end{bmatrix} = S$$
 
$$\begin{bmatrix} * \end{bmatrix} = * & [\inf] = \inf \\ Tr \to T \end{bmatrix} = ref$$
 
$$[T \to T]$$
 
$$\begin{aligned} & \operatorname{ref} T \rhd \operatorname{ref} T & * \rhd \operatorname{ref} * \\ & T_1 \to T_2 \rhd T_1 \to T_2 & * \rhd * \to * \end{aligned}$$
 
$$T \sim T$$
 
$$\begin{aligned} & \operatorname{int} \sim \operatorname{int} & * \sim T & T \sim * \end{aligned}$$
 
$$\frac{T_1 \sim T_2}{\operatorname{ref} T_1 \sim \operatorname{ref} T_2} & \frac{T_1 \sim T_3}{T_1 \to T_2 \sim T_3 \to T_4}$$

**Figure 3.** Translation from  $\lambda_{\rightarrow}^{\star}$  to  $\lambda_{\ell}^{\Downarrow}$ .



Protect invariants?

- Protect invariants?
- Reliable documentation?

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- Enable optimizations?

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- Reliable documentation?
- Enable optimizations?

Any untyped code

=>

No compositional reasoning!

# STAGE IV: ACCEPTANCE

Interoperability & Performance

```
def get_numbers(count)->List(Int):
    ....
    return nums
```

• List is mutable, standard approach is to proxy

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

• The proxy must be compatible with existing code

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

The proxy must be compatible with existing code

```
nums.append(....)
len(nums)
nums is nums
```

#### Performance

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

#### Performance

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def get_numbers(count)->List(Int):
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```

Allocation cost

#### Performance

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

- Allocation cost
- Traverse, recursively proxy

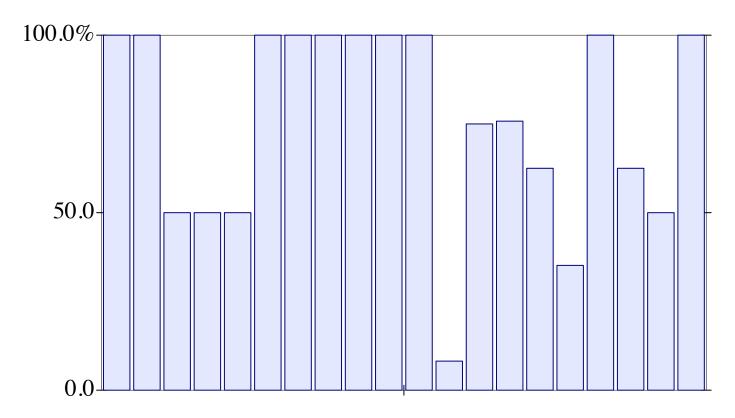
#### Performance

```
def get_numbers(count)->List(Int):
    ....
    return proxy(nums, List(Int))
```

- Allocation cost
- Traverse, recursively proxy
- Interpose on future operations

- 20 programs
- Measured all gradually-typed configurations
- How many 20-deliverable?

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- How many 20-deliverable?



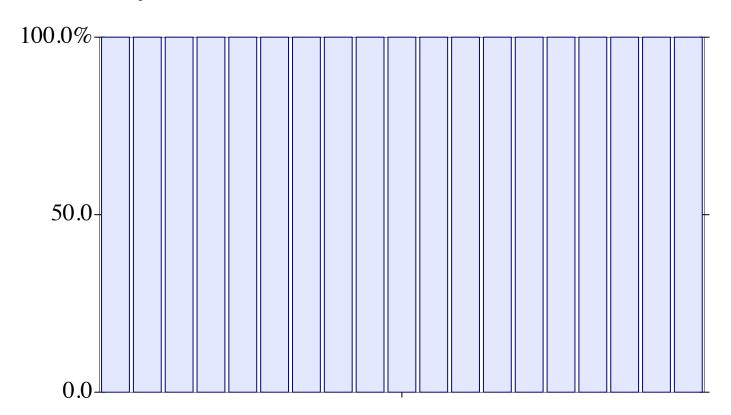
#### **Worst-Case Overhead**

acquire	5	quadBG	4
dungeon	10	quadMB 13	39
forth	27	sieve	43
fsm	1527	snake 3	32
fsmoo	233	suffixtree 2	29
gregor	2	synth	47
kcfa	5	take5	1
Inm	1	tetris 3	34
mbta	1	zombie 29	92
morsecode	1	zordoz	1

Frequently an order-of-magnitude slowdown

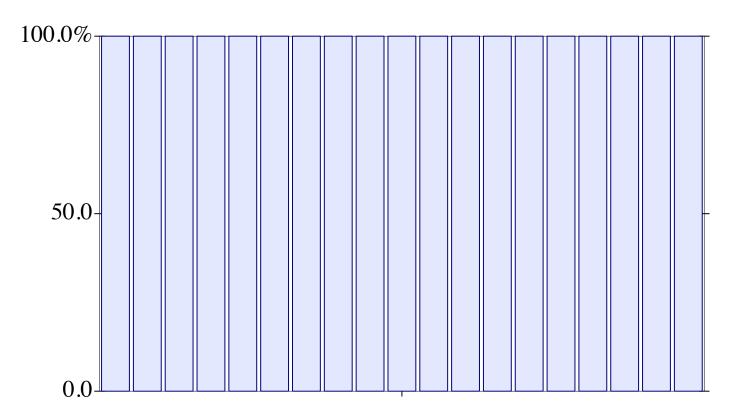
- 19 **different** programs
- Measured all function-level configurations
- How many 20-deliverable?

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- 19 **different** programs
- Measured all function-level configurations
- How many 10-deliverable?

- 19 **different** programs
- Measured all function-level configurations
- How many 10-deliverable?



#### **Worst-Case Overhead**

futen	1	meteor 2	) -
http2	3	nbody 1	
slowSHA	2	nqueens 1	
call_method	7	pidigits 1	
call_method_slots	8	pystone 2	) -
call_simple	3	spectralnorm 8	)
chaos	3	Espionage 5	)
fannkuch	1	PythonFlow 7	7
float	3	take5 1	
go	7		

Never an order-of-magnitude slowdown

# STAGE V: MOVING ON

#### Moving On

- Q1. Is Reticulated's soundness practical?
- Q2. Can Typed Racket soundness be performant?
- Q3. Is Typed Racket soundness portable?
- Q4. Is there a useful, "efficient" Soundness 3.0?

### Granularity

```
@fields({"x": Int, "y": Int})
class Point:
    x = 0
    y = 0

def get_x(self:Point)->Int:
    return self.x
```