

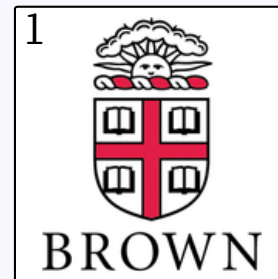
The Behavior of Gradual Types: A User Study

Preston Tunnell Wilson¹

Ben Greenman² ★

Justin Pombrio¹

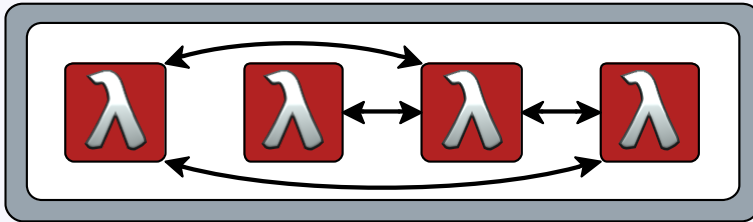
Shriram Krishnamurthi¹



Intuition: Gradual Typing

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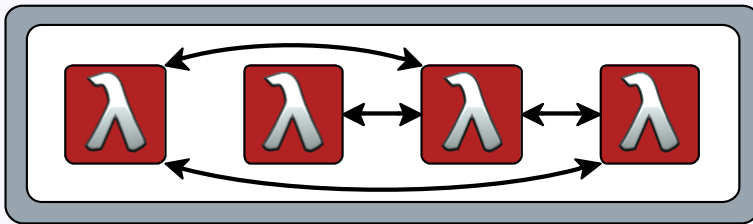
Dynamic Typing



un(i)typed components
value safe

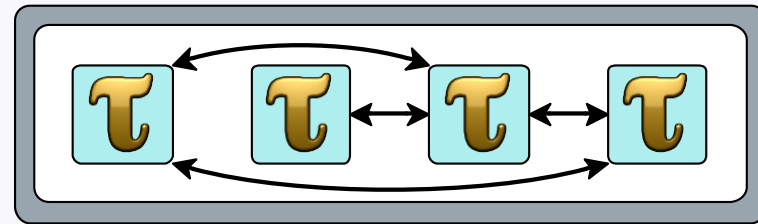
Intuition: Gradual Typing

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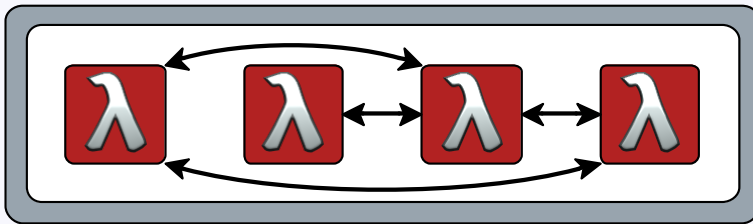
Static Typing



typed components
type safe

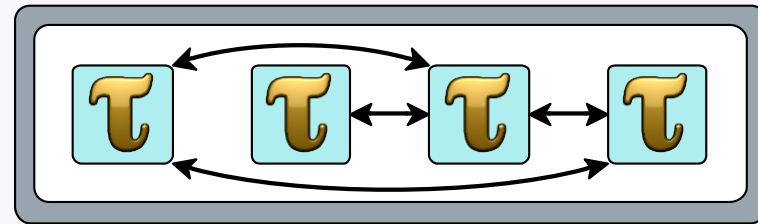
Intuition: Gradual Typing

Dynamic Typing



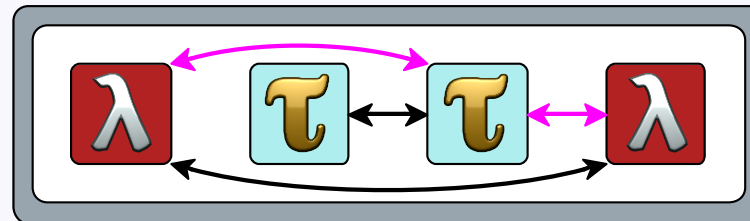
un(i)typed components
value safe

Static Typing



typed components
type safe

Gradual Typing



typed + untyped components
.... safe?

Gradual Typing Helps Programmers?

DLS '14

Combining static and dynamic typing within the same language **offers clear benefits** to programmers

Gradual Typing Helps Programmers?

ESOP '12

We conjecture that a **programmer would like** the guarantee that the values produced by their components are never used in violation to the interface specifications ...

Gradual Typing Helps Programmers?

POPL '17

... [run-time checks] inspect the top-level type (or type-tag) of each value, ensuring safe interaction and providing **the expected type safety** to programmers

Gradual Typing Helps Programmers?

A programmer **may favour** unsound monitoring over wrappers that change the semantics of their program.

ECOOP '17

Gradual Typing Helps Programmers?

Being sound, Safe TypeScript endows types with many of the properties that Java or C# programmers **might expect** but not find in TypeScript

The system **lives up to all expectations** that developers have of sound language implementations.

... programmers should be able to add or remove type annotations without any **unexpected** impacts on their program

POPL '15

SNAPL '17

SNAPL '15

POPL '08

OOPSLA '17

ECOOP '14

Data to Support Claims?

DLS '14

ESOP '12

POPL '17

ECOOP '17

POPL '15

SNAPL '17

SNAPL '15

POPL '08

OOPSLA '17

ECOOP '14

Data to Support Claims?

| | |
|------------|---|
| DLS '14 | ✗ |
| ESOP '12 | ✗ |
| POPL '17 | ✗ |
| ECOOP '17 | ✗ |
| POPL '15 | ✗ |
| SNAPL '17 | ✗ |
| SNAPL '15 | ✗ |
| POPL '08 | ✗ |
| OOPSLA '17 | ✗ |
| ECOOP '14 | ✗ |

Three Different Approaches!

- DLS '14
- ESOP '12
- POPL '17
- ECOOP '17
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Deep

Shallow

Erasure

Three Different Approaches!

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Deep

types are sound/enforced

Shallow

Erasure

Three Different Approaches!

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typed code cannot
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Deep

types are sound/enforced

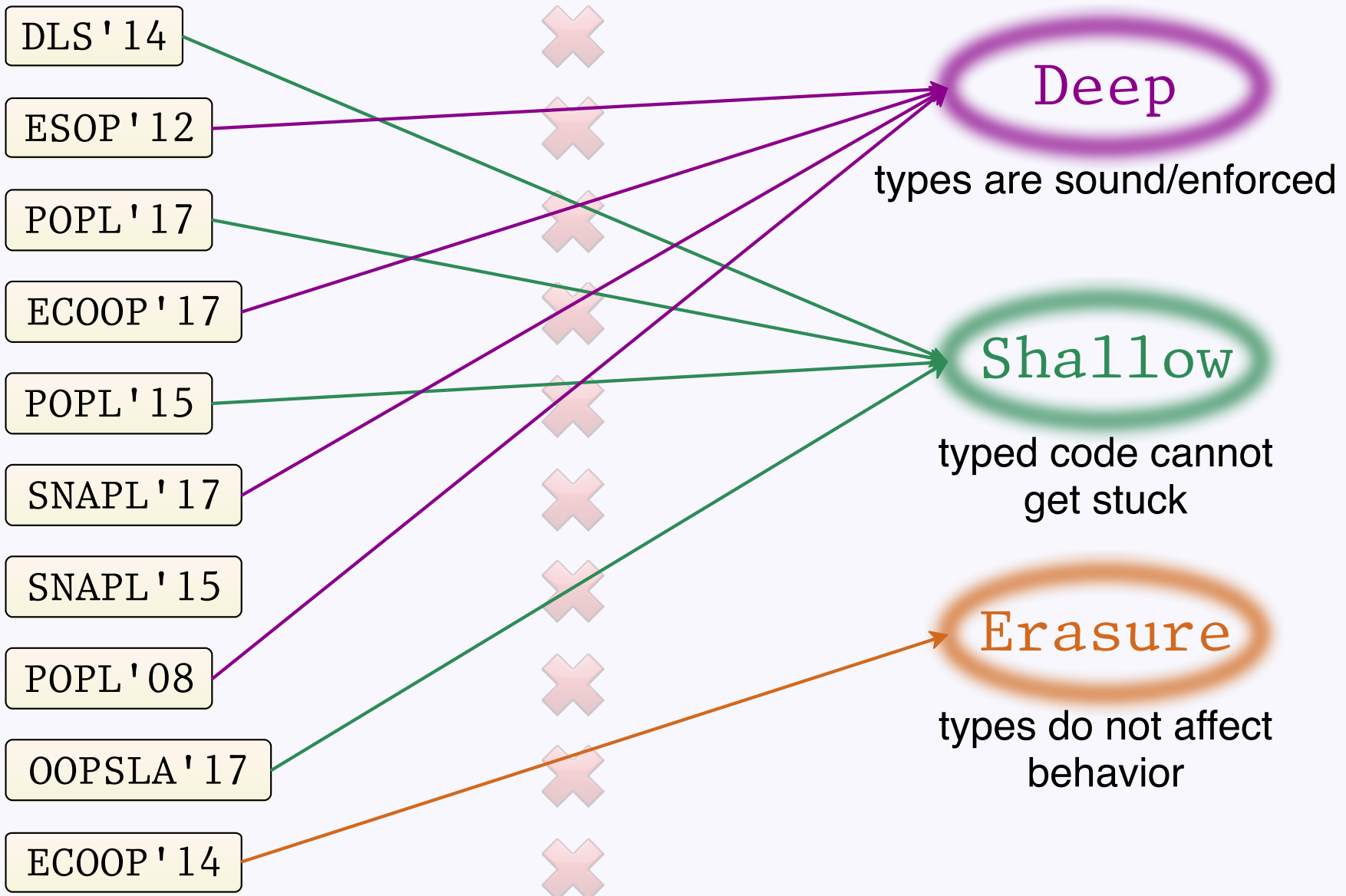
Shallow

typed code cannot
get stuck

Erasure

types do not affect
behavior

Three Different Approaches!



In this paper:

We begin to **address the lack of data** with a **developer survey** contrasting the different approaches to gradual typing

Deep vs. Shallow
Erasure

Survey based on 8 example programs

| | | | |
|--|--|--|--|
| | | | |
| | | | |

Survey Prompt

We are designing a language that mixes typed and untyped code.

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We want your opinion on what should happen when untyped values flow into typed expressions.

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We are not looking for feedback on syntax.

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Question 7

```
1 | var x : Array(String) = ["hi" "bye"];  
2 | var y = x;  
3 | var z : Array(Number) = y;  
4 | z[0] = 42;  
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```

Type annotations

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Array operations

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Multiple behaviors
(unlabeled)

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Error: line 4 expected `String` got `42`

Error: line 5 expected `Number` got `"bye"`

`"bye"`

Multiple behaviors
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```

Error: line 4 expected String got 42

Error: line 5 expected Number got "bye"
"bye"

(Deep)

(Shallow)

(Erasure)

Like Dislike

Expected

Unexpected

| | |
|--|--|
| | |
| | |

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Question 7

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|------------|------|---------|
| | Like | Dislike |
| Expected | LE | DE |
| Unexpected | LU | DU |

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Question 7

| | Like | Dislike |
|------------|-----------------------------|-----------------------------|
| Expected | <input type="checkbox"/> LE | <input type="checkbox"/> DE |
| Unexpected | <input type="checkbox"/> LU | <input type="checkbox"/> DU |

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| LE | LU | DE | DU |
|--------------------------|--------------------------|--------------------------|--------------------------|
| <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
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LE LU DE DU

Two distinct behaviors

Question 5

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1 | var obj0 = {  
   |     k = 0;  
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2 | var t = "hello";  
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5 | k
```

Error: line 1 expected Number got "hello"
"hello"

Two distinct behaviors

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5 k
```

Error: line 1 expected Number got "hello"
"hello"

(Deep, Shallow)
(Erasure)

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LE LU DE DU

Error: line 1 expected Number got "hello"

"hello"

Objects instead of closures,
to avoid confusion

Question 5

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"hello"

LE LU DE DU

| | | | |
|-----------------------|-----------------------|-----------------------|-----------------------|
| <input type="radio"/> | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> |
| <input type="radio"/> | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> |

Followup Question

Agree/Disagree: Type annotations should not change the behavior of a program.

Summary: Survey Design

Solicit opinions on the semantics of a "new" language

Gather Like \times Expect preference on eight small programs designed to classify approaches

Explicit followup about optional typing

Survey Prompt

We are designing a language that mixes typed and untyped code.
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|---|-----------------------|-----------------------|-----------------------|-----------------------|
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Why 8?

Explicit followup about optional typing

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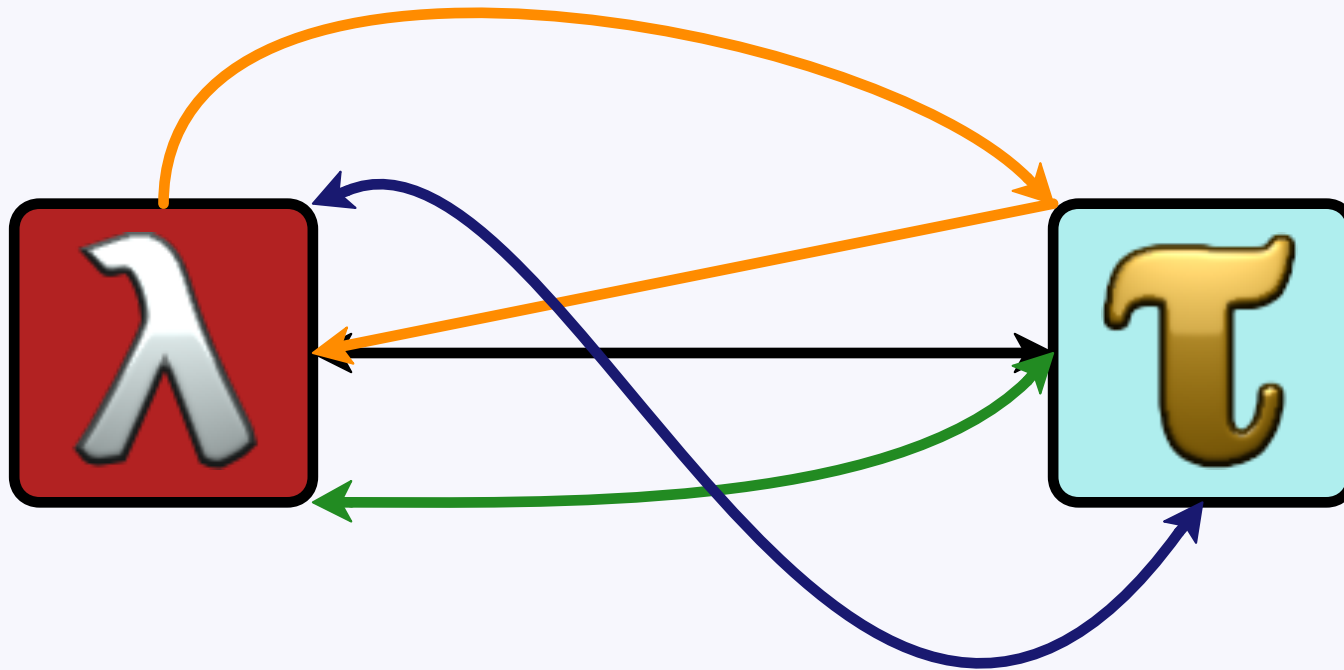
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GOAL: COVER ALL INTERACTIONS



Summary: Survey Design

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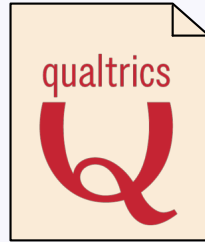
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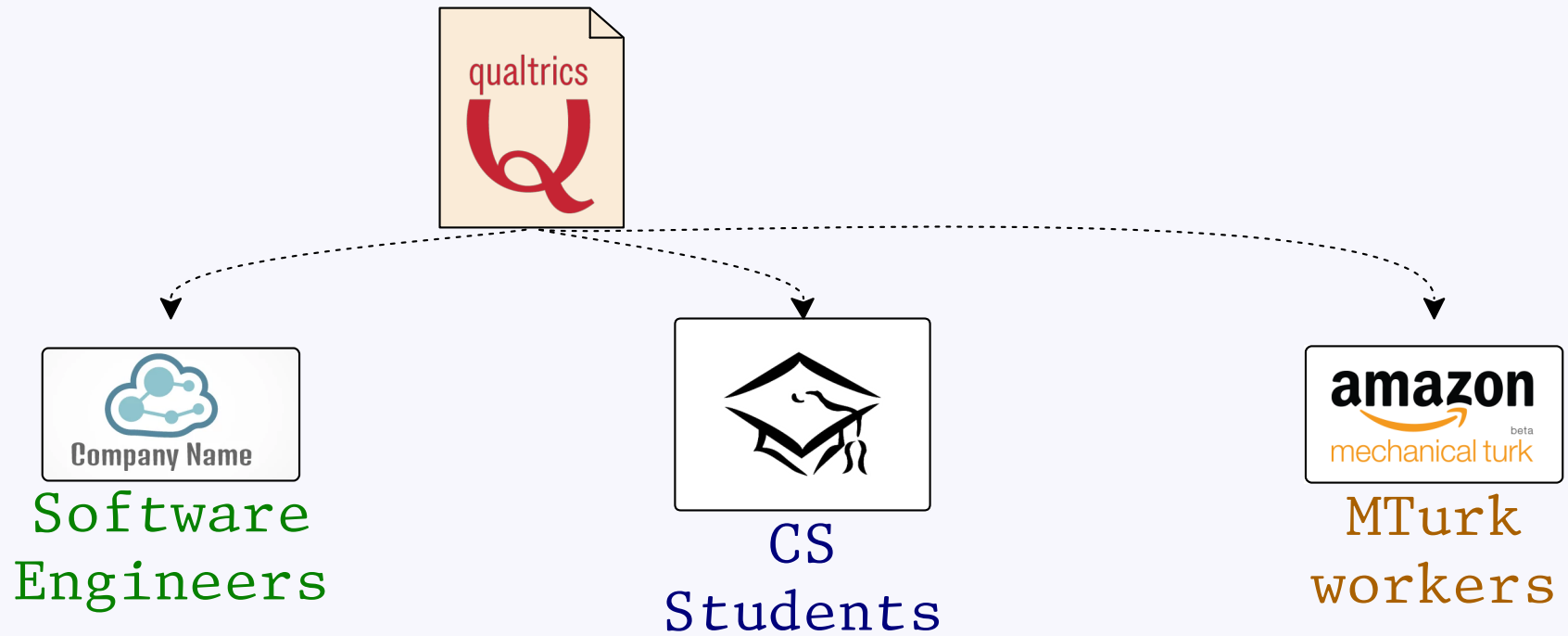
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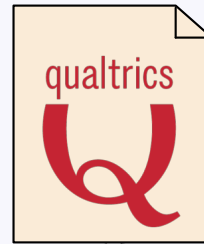
Distribution



Distribution

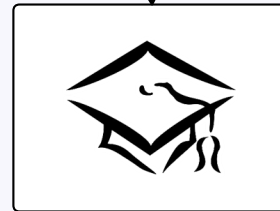


Distribution



Software
Engineers

34 participants



CS
Students

17 participants



MTurk
workers

90 participants
(96 filtered)

Results

Question 1

```
1 | var t = [4, 4];  
2 | var x : Number = t;  
3 | x
```

LE LU DE DU

Error: line 2 expected Number got [4, 4]

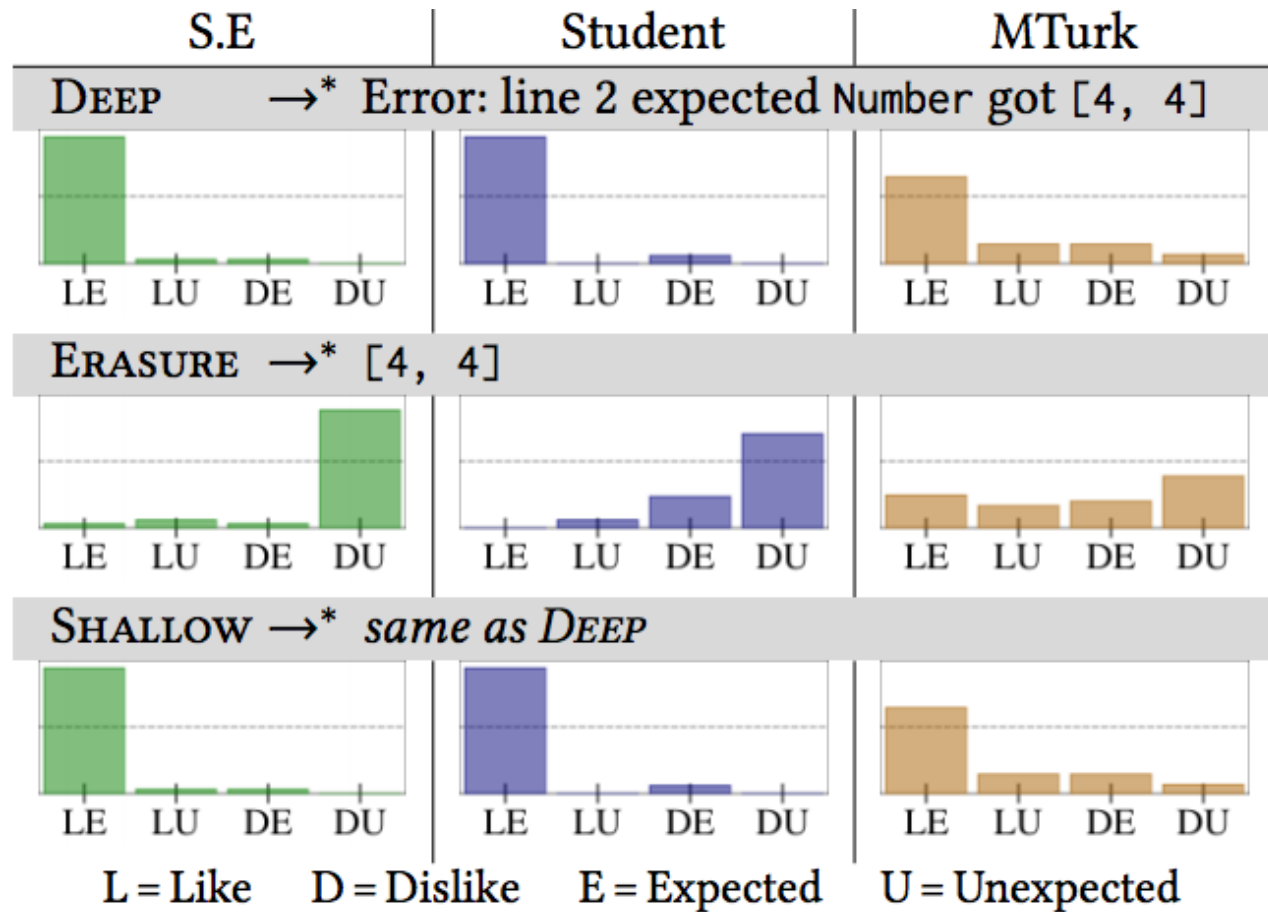
[4, 4]

Question 1

```

1 | var t = [4, 4];
2 | var x : Number = t;
3 | x
  
```

Error: line 2 expected
[4, 4]



Followup Question

Agree/Disagree: Type annotations should not change the behavior of a program.

Followup Question

Agree/Disagree: Type annotations should not change the behavior of a program.



Software
Engineers

44% agree



CS
Students

12% agree

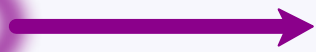


MTurk
workers

51% agree

Conclusions

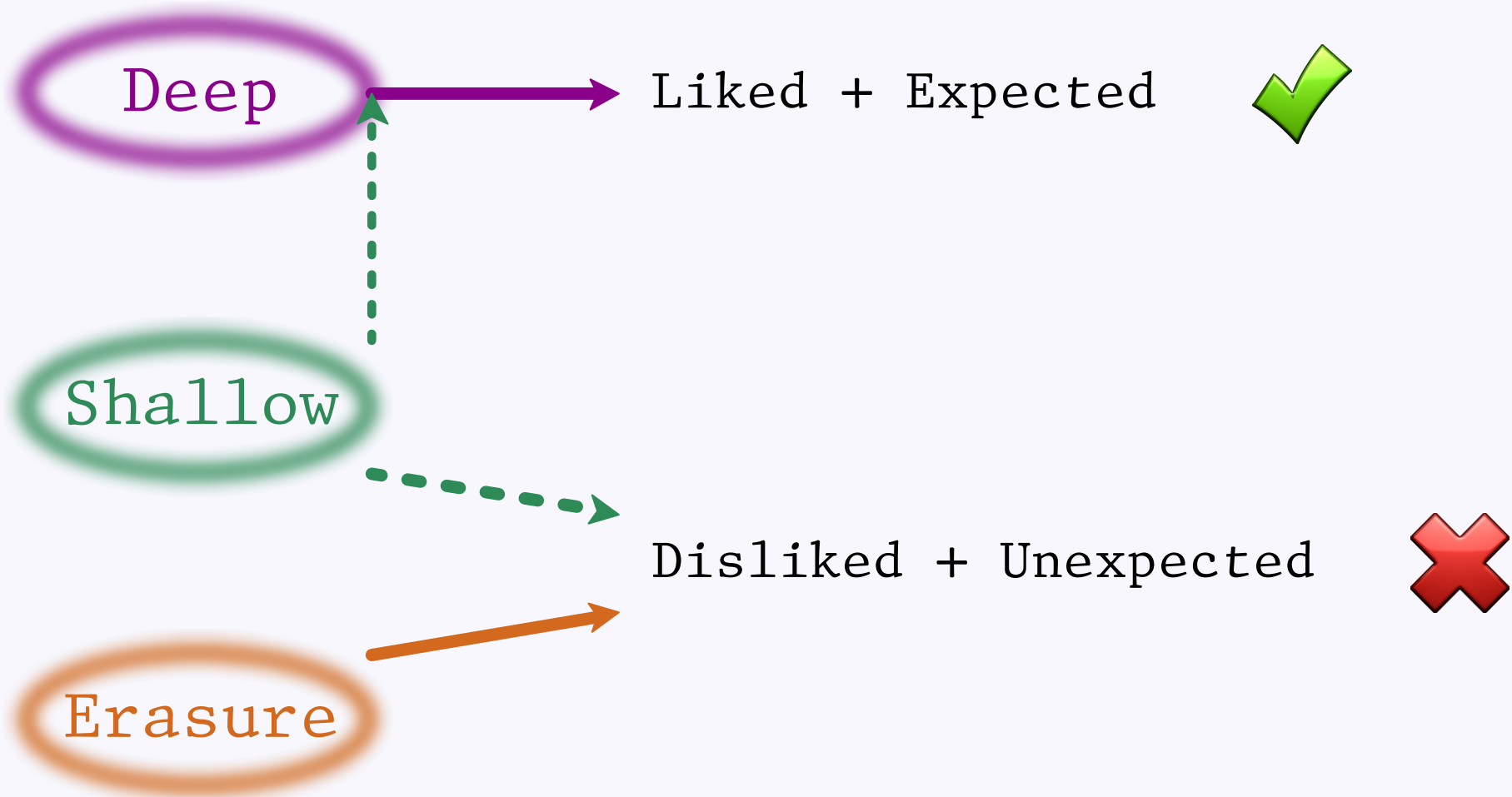
Deep



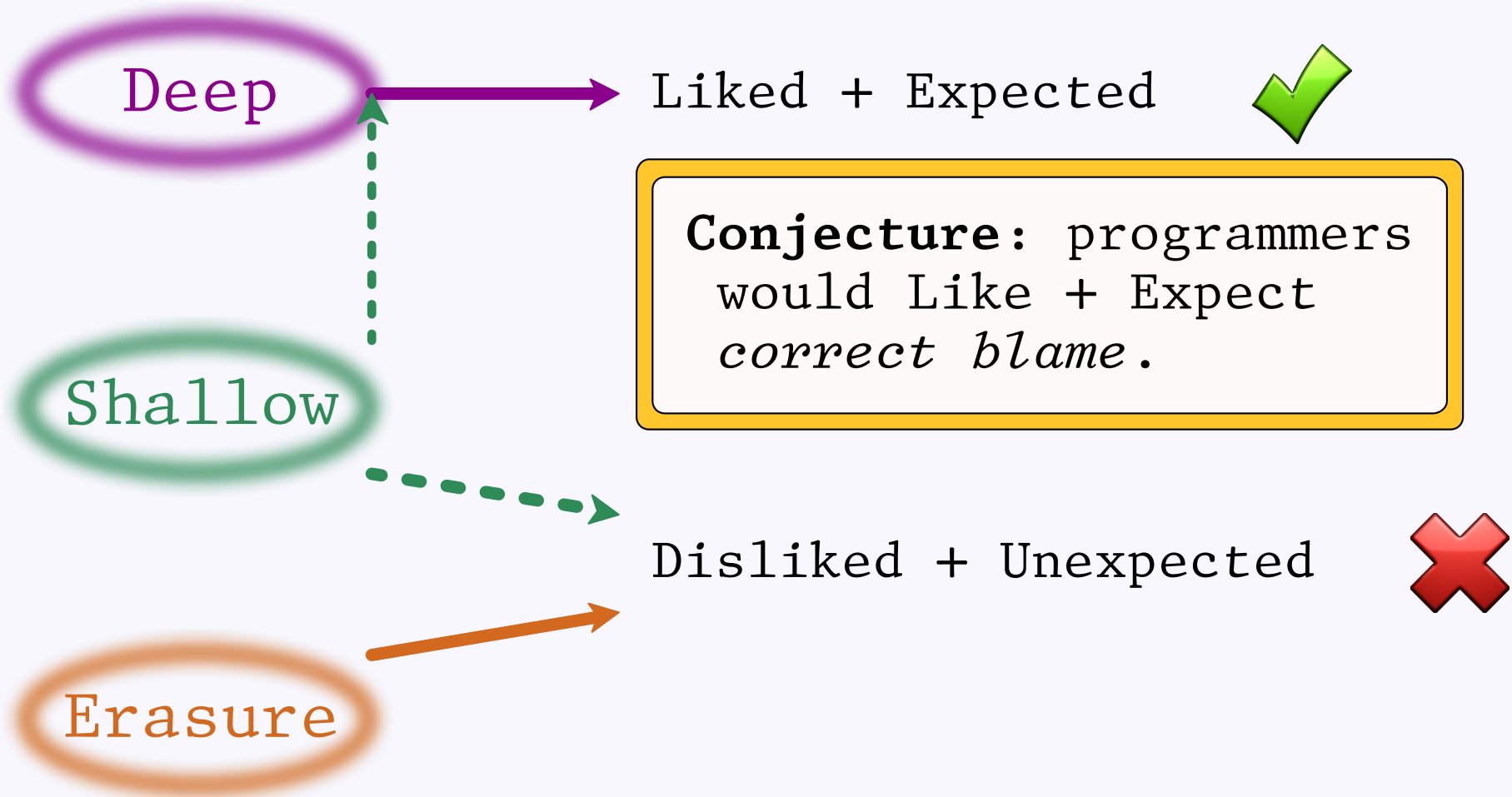
Liked + Expected



Conclusions



Conclusions



Takeaways

Unless there's a strong reason, choose **Deep**

Programmers seem to expect it!

Non-**Deep** languages must **document** their design and rationale

Start with the survey examples

cs.brown.edu/research/plt/d1/d1s2018

Threats to Validity

Indirect questions ("new" language)

Possible ambiguity:

- lack of type inference

- interpretation of code / error outputs

- runtime vs. static errors

Threats to Generalizability

Selective engineer + student populations

Very diverse MTurk population

Other implications:

runtime performance

quality of error messages

Concrete Types



`concrete = every value carries a runtime type`

`Limits expressiveness of "untyped" code`

`Preferred by Dart users?`

Another point to explore!

Followup Question

Agree/Disagree: Type annotations should not change the behavior of a program.



Software
Engineers

44% agree



CS
Students

12% agree



MTurk
workers

51% agree

Followup Question

Agree/Disagree: Type annotations should not change the behavior of a program.



amazon

S
Er

44

| Pop. | ERASURE Opinion | Agree | Disagree |
|---------|--------------------|-------|----------|
| S.E. | Like | 1 | 0 |
| | Dislike | 14 | 19 |
| Student | Like | 0 | 0 |
| | Dislike | 2 | 14 |
| MTurk | Like | 19 | 11 |
| | Dislike | 18 | 25 |

S

ee

Question 5

```
1 | var obj0 = {  
    |     k = 0,  
    |     add = function(i : Number) { k = i }};  
2 | var t = "hello";  
3 | obj0.add(t);  
4 | var k : String = obj0.k;  
5 | k
```

LE LU DE DU

Error: line 1 expected Number got "hello"

"hello"

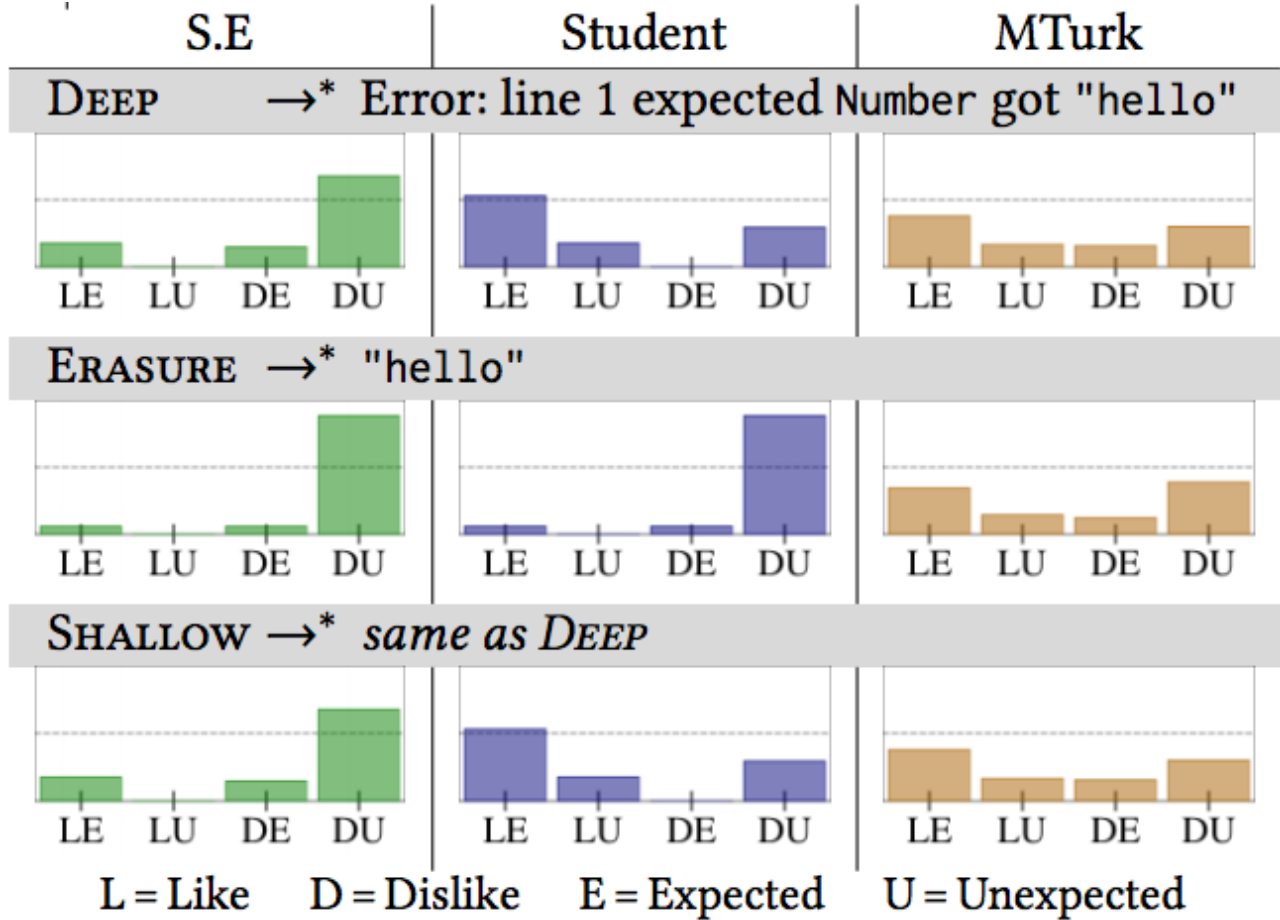
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3 | obj0.add(t);
4 | var k : String
5 | k

```

Error: line 1 expected
"hello"



Question 5

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| | LE | LU | DE | DU |
|---|-----------------------|-----------------------|-----------------------|-----------------------|
| Error: line 1 expected Number got "hello" | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> |
| "hello" | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> | <input type="radio"/> |

Why is the compiler complaining about line 1? The error message should be attached to **line 3**, that's the source of the problem!

Question 5

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2 | var t = "hello";  
3 | obj0.add(t);  
4 | var k : String = obj0.k;  
5 | k  
   |  
   | LE LU DE DU  
Error: line 3 expected Number got "hello" ○ ○ ○ ○  
"hello" ○ ○ ○ ○
```

Why is the compiler complaining about line 1? The error message should be attached to **line 3**, that's the source of the problem!

Question 5

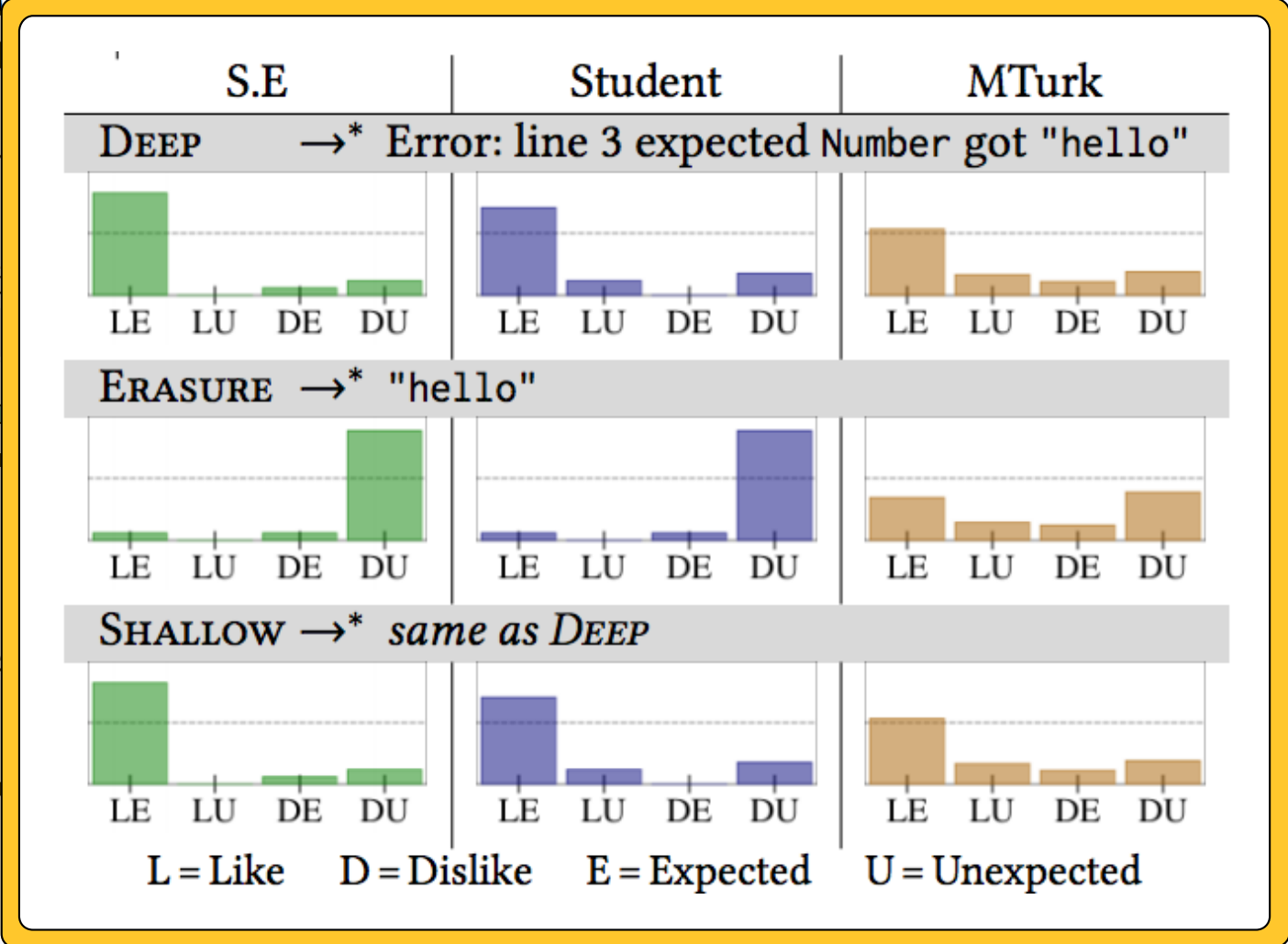
```

1 | var obj0 = {
   |     k = 0,
   |     add = function(x, Number) {
2 |         var t = "hello";
3 |         obj0.add(t);
4 |         var k : String;
5 |         k

```

Error: line 3 expected
"hello"

Why is line 1? attached of the



Question 7

```
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3 | var z : Array(Number) = y;  
4 | z[0] = 42;  
5 | var a : Number = z[1];  
6 | a
```

LE LU DE DU

Error: line 4 expected String got 42

Error: line 5 expected Number got "bye"

"bye"

Question 7

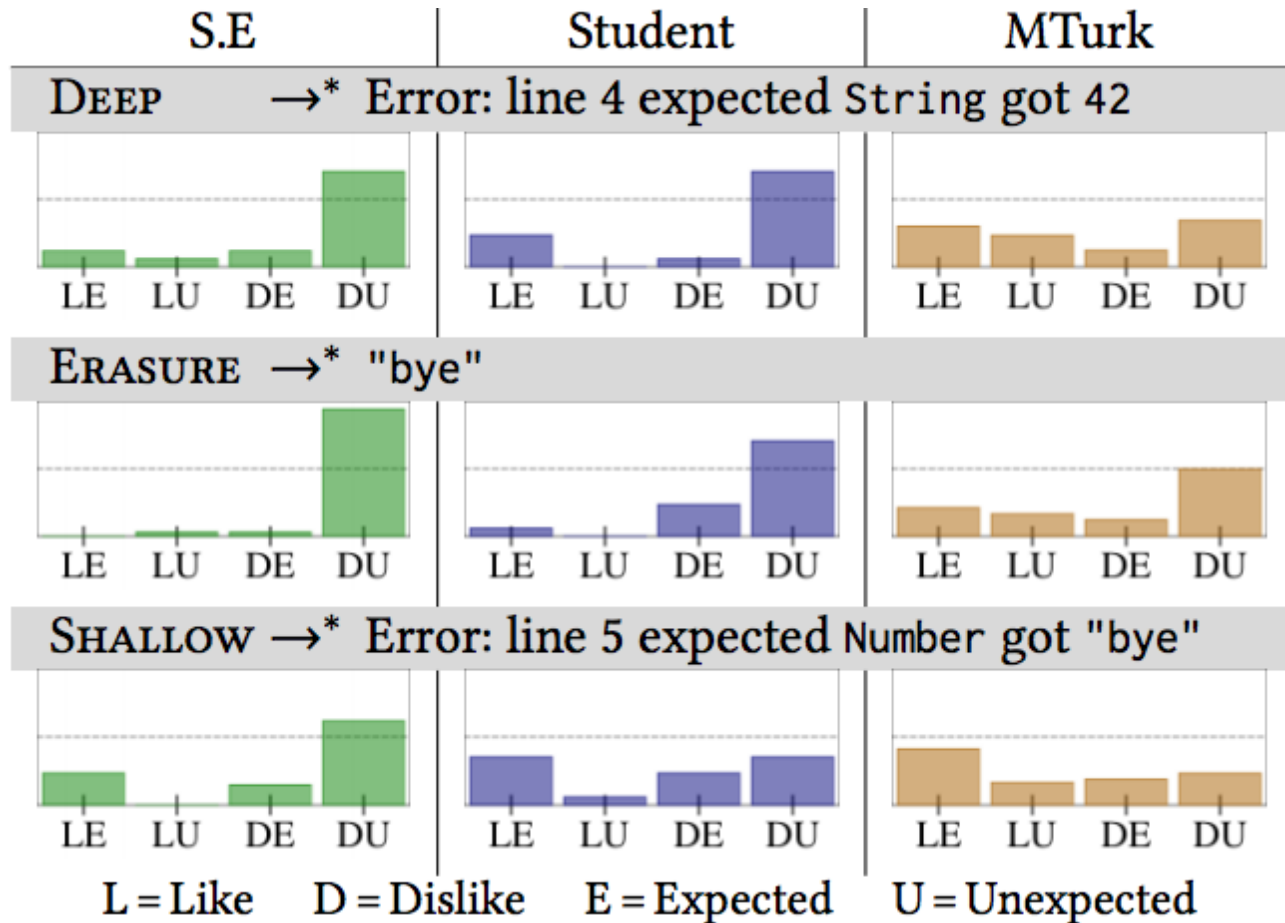
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2 | var y = x;
3 | var z : Arra
4 | z[0] = 42;
5 | var a : Numb
6 | a

```

Error: line 4 expected

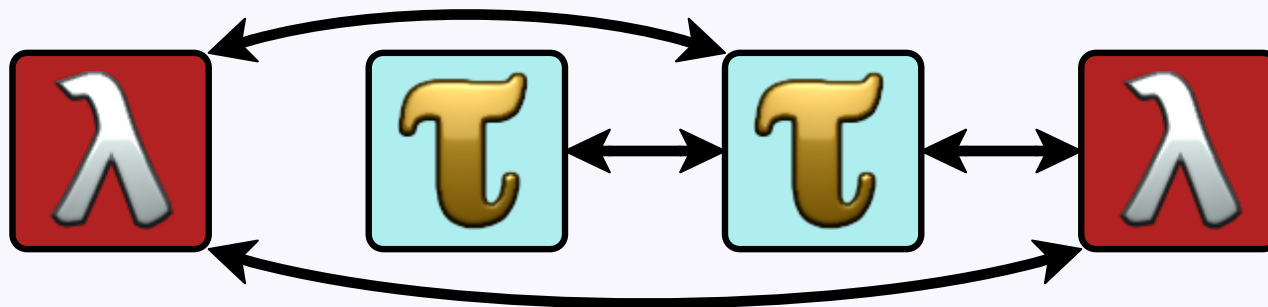
Error: line 5 expected
"bye"



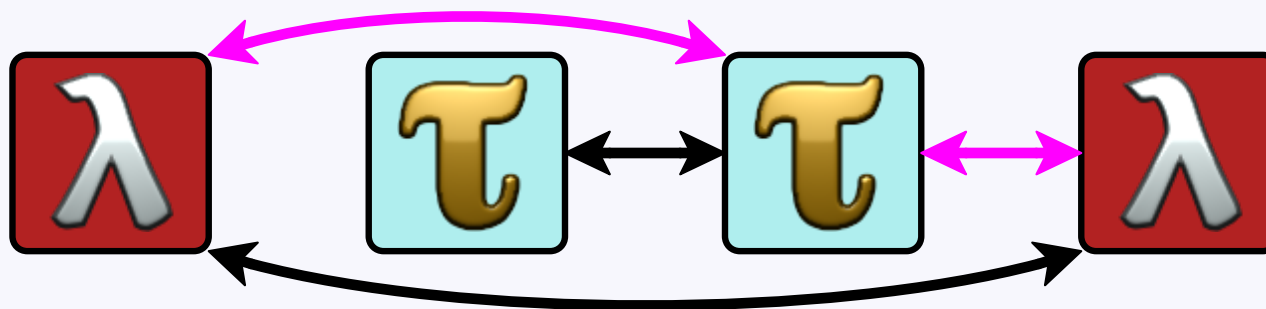
Shallow cannot get 'stuck' if:

1. Total reduction relation for dynamic code
2. Partial reduction relation for static code (possible to get stuck)
3. Shallow checks can distinguish stuck vs. non-stuck states

Three Approaches to G.T.



How to enforce the type boundaries?

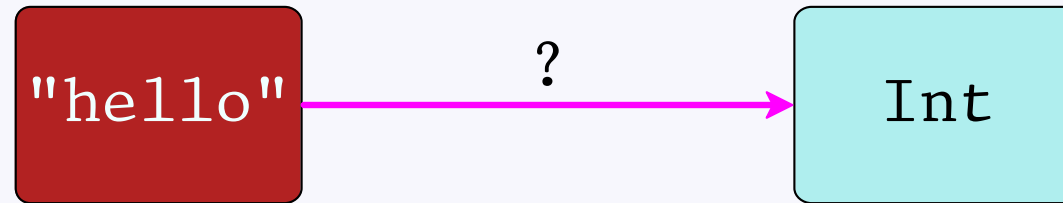


Example: Base Type

Deep

Shallow

Erasure



Example: Base Type

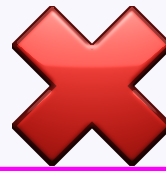
Deep



Shallow

Erasure

"hello"



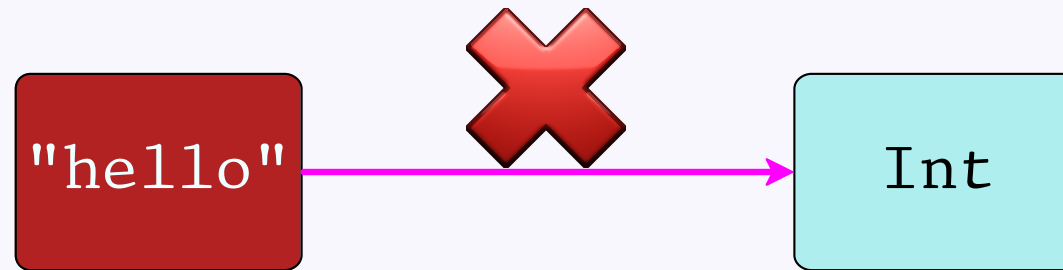
Int

Example: Base Type

Deep

Shallow

Erasure

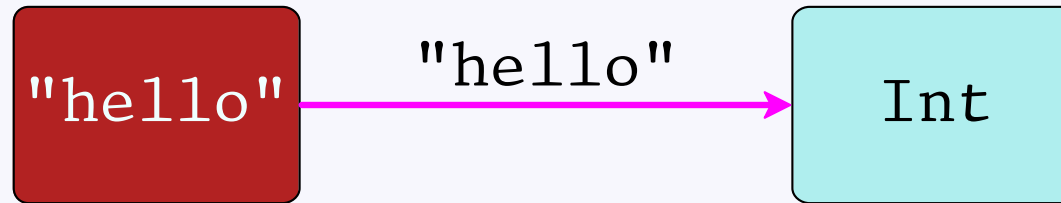


Example: Base Type

Deep

Shallow

Erasure

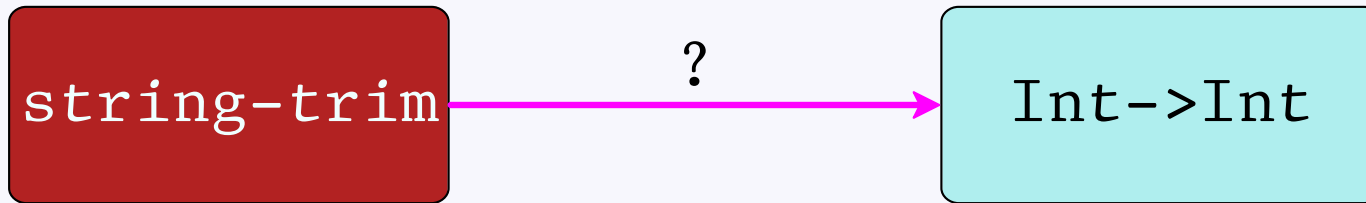


Example: Higher-Order Type

Deep

Shallow

Erasure



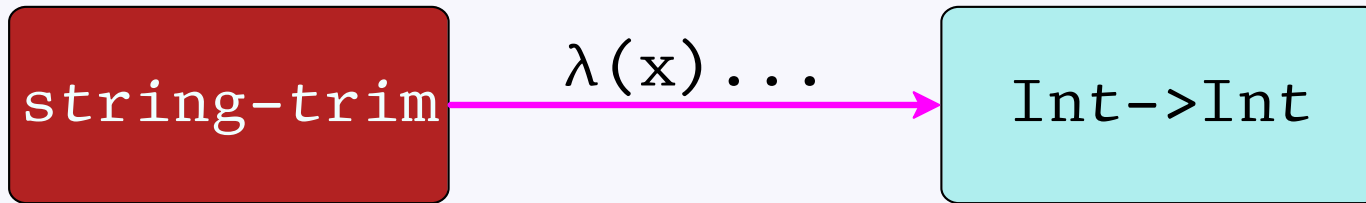
Example: Higher-Order Type

Deep



Shallow

Erasure

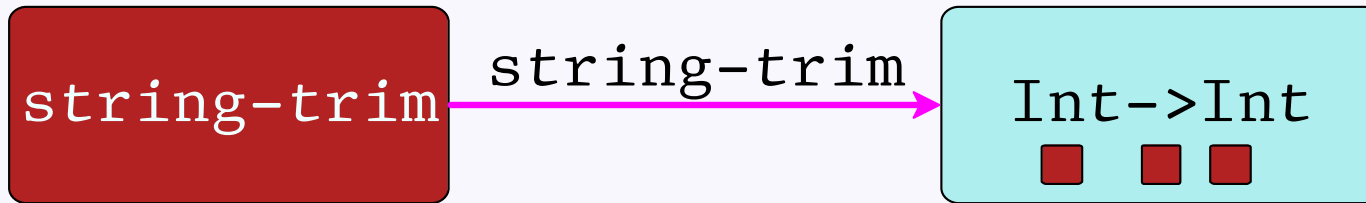


Example: Higher-Order Type

Deep

Shallow

Erasure

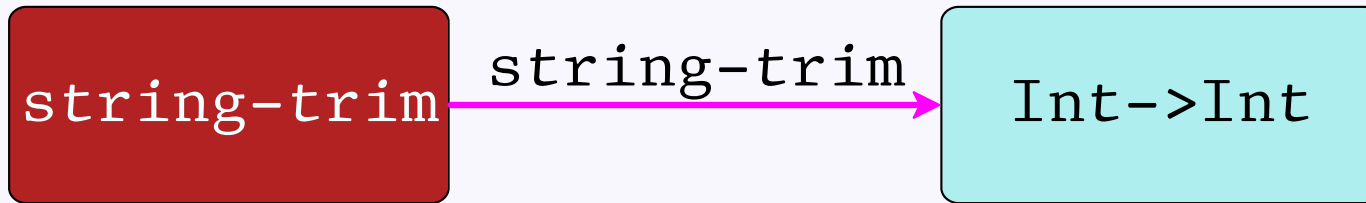


Example: Higher-Order Type

Deep

Shallow

Erasure

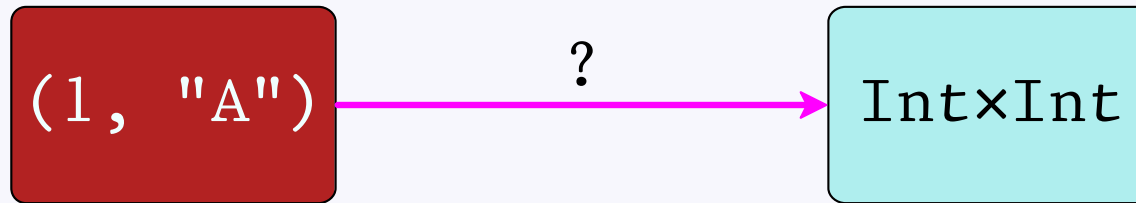


Example: Inductive Type

Deep

Shallow

Erasure



Example: Inductive Type

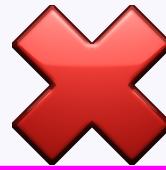
Deep

Shallow

Erasure



(1, "A")



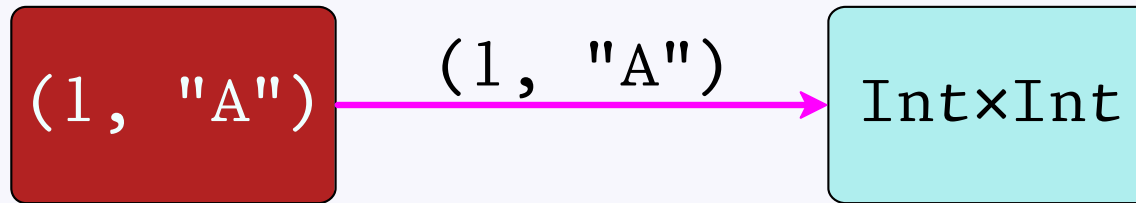
Int×Int

Example: Inductive Type

Deep

Shallow

Erasure

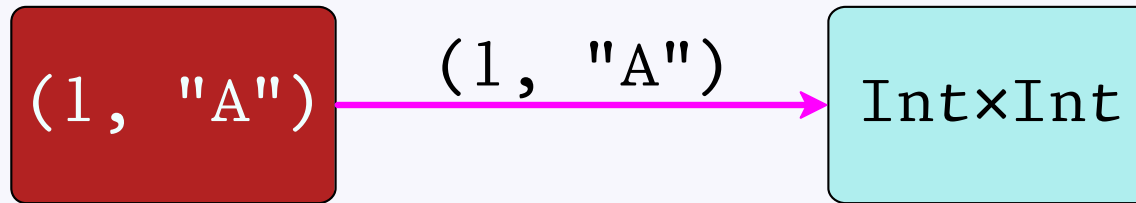


Example: Inductive Type

Deep

Shallow

Erasure



Three Approaches, Summary

| | Deep | Shallow | Erasure |
|--------------------------|-------------------------|----------------------|---------|
| invariant | t | C(t) | v |
| base types | check | check | - |
| coinductive types | wrap | check | - |
| inductive types | traverse | check | - |
| boundaries | static, higher-order | static, selectors | - |