

CS345H: Programming Languages

Lecture 13: Type Inference II

Thomas Dillig

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- ▶ This is a **team project**: Teams must be between 3 and 5 students

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- ▶ Your creativity is the limit

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- ▶ Any questions?

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- ▶ Big idea: Replace all concrete type assumptions with type variables
- ▶ Collect **constraints** on these type variables
- ▶ Find most general solution for these constraints to deduce types

Quick Refresher

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let f = lambda x.(f x) in f
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$$\frac{\begin{array}{c} \Gamma[f \leftarrow a_1][x \leftarrow a_2] \vdash f : a_1 \\ \Gamma[f \leftarrow a_1][x \leftarrow a_2] \vdash x : a_2 \\ a_1 = a_2 \rightarrow a_3 \end{array}}{\frac{\Gamma[f \leftarrow a_1][x \leftarrow a_2] \vdash (f \ x) : a_3}{\Gamma[f \leftarrow a_1] \vdash \lambda x.(f \ x) : a_1} \quad \Gamma[f \leftarrow a_1]f \vdash : a_1} \Gamma \vdash \text{let } f = \lambda x.(f \ x) \text{ in } f : a_1$$

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- ▶ This yielded constraint system

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- ▶ **Today:** How to efficiently solve type constraint systems

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- ▶ Observe that $X \rightarrow Y$ is just in-fix notation for *function*(X, Y)
- ▶ To solve type constraints more efficiently, we will write $X \rightarrow Y$ also as *function*(X, Y), but this is just notation

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- ▶ Specifically, if we process constraint of the form $X = Y$, we know that X and Y are equal
- ▶ In this case, we want to **union** the equivalence classes of X and Y
- ▶ Also, if X and Y are function types of the form $X_1 \rightarrow X_2$ and $Y_1 \rightarrow Y_2$, we also want to union X_1 and Y_1 as well as X_2 and Y_2

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- ▶ Each set of types is called an **equivalence class**
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- ▶ **For type inference:** If an equivalence contains a type constant or a function type, we will always use this type as the representative.

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Union-Find Representation

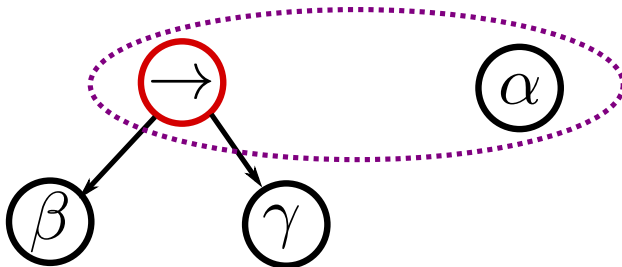
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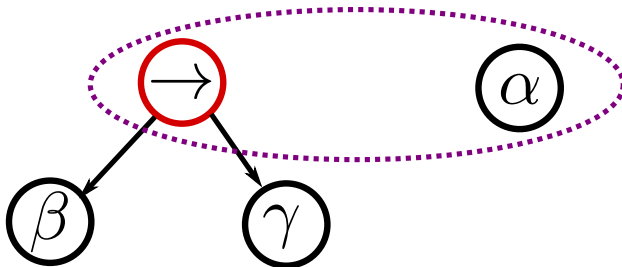
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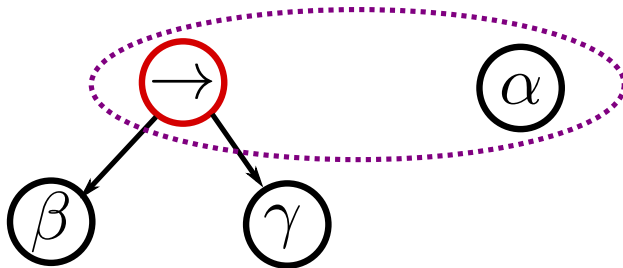
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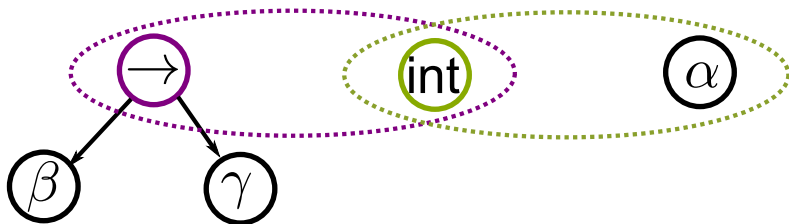
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- ▶ And find will return the (red) representative in this class

Union-Find Representation Cont.

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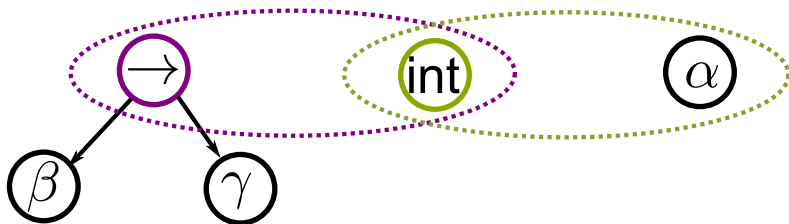
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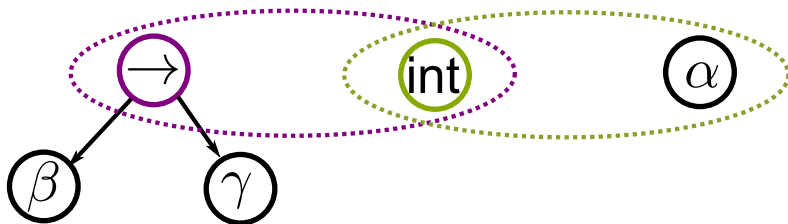
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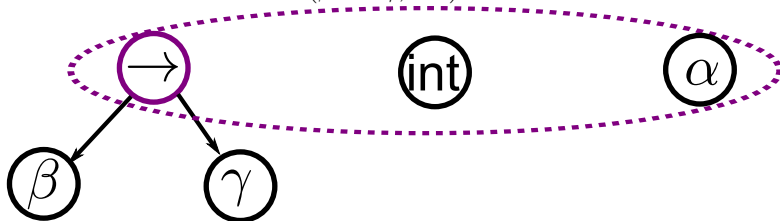
- And now consider $\text{union}(\beta \rightarrow \gamma, \text{int})$

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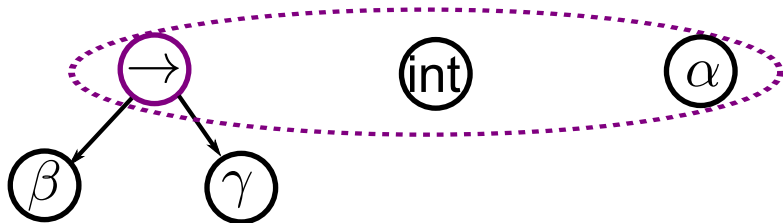
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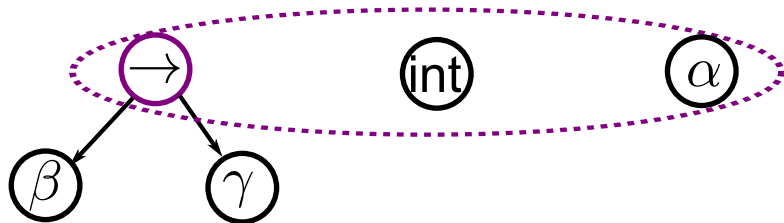


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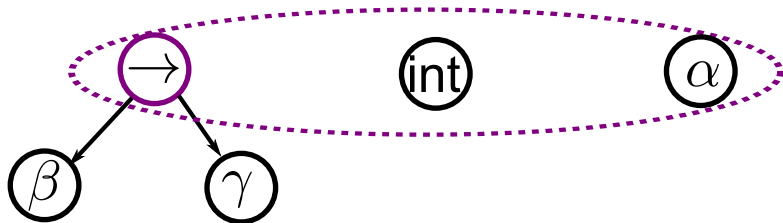
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- ▶ No! If a function type and a constant type ever end up in the same equivalence class, we know that the constraint system has no solution
- ▶ We also know constraint system has no solution if *Int* and *String* end up in the same EQ

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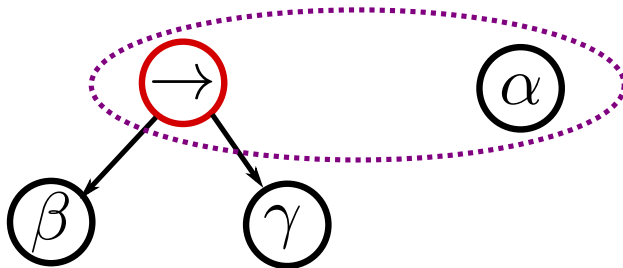
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- ▶ **Question:** Why do we always pick function types or type constants as representatives?
- ▶ **Question:** What happens if a function type and a type constant are in the same equivalence class?

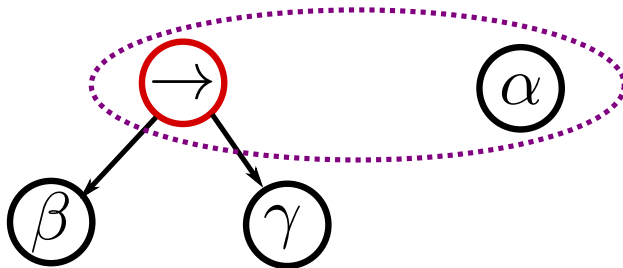
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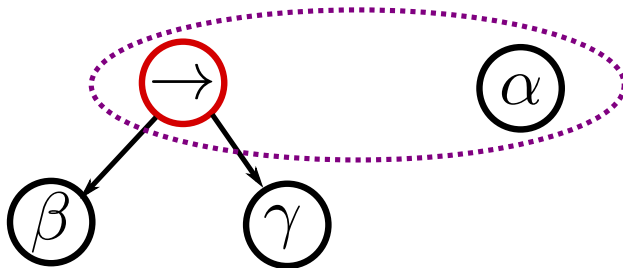
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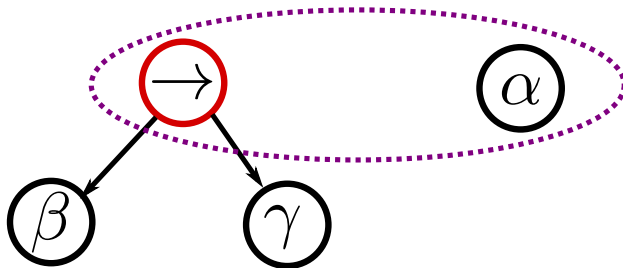


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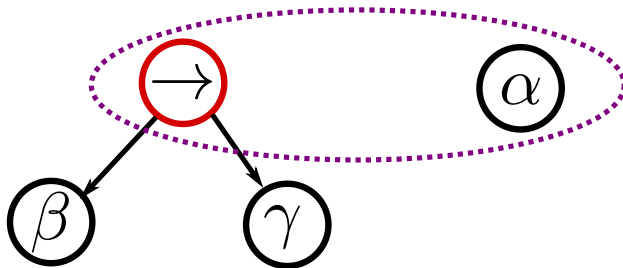


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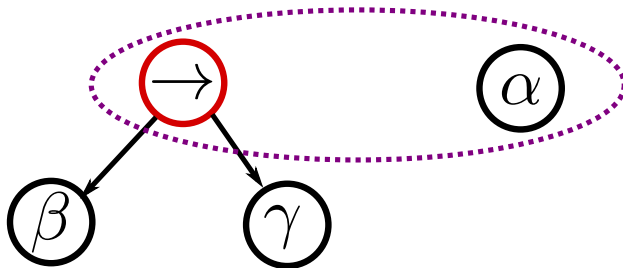
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- ▶ How do we find solution for α ?
- ▶ $find(\alpha) = \beta \rightarrow \gamma$
- ▶ What about β ?
- ▶ Every item is in its own EQ, therefore $find(\beta) = \beta$

Using Union-Find for solving Type Inference Constraints

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Using Union-Find for solving Type Inference Constraints

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- ▶ We then apply the following function to each equality in our type constraint:

```
bool unify(m, n) {  
    s = find(m); t = find(n);  
    if(s == t) return true;  
    if(s == s1  $\rightarrow$  s2 && t == t1  $\rightarrow$  t2) {  
        union(s, t);  
        return unify(s1, t1) && unify(s2, t2);  
    }  
    if(is_variable(s) || is_variable(t)) {  
        union(s, t); return true;  
    }  
    return false; //No solution to type constraints  
}
```

Example

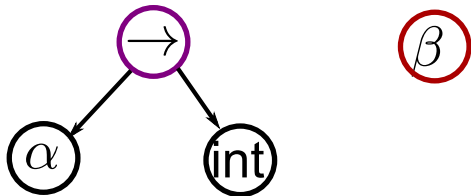
- ▶ Consider the following system of type constraints:

$$\begin{array}{rcl} \alpha \rightarrow Int & = & \beta \\ \gamma \rightarrow Int & = & \beta \\ \gamma & = & String \end{array}$$

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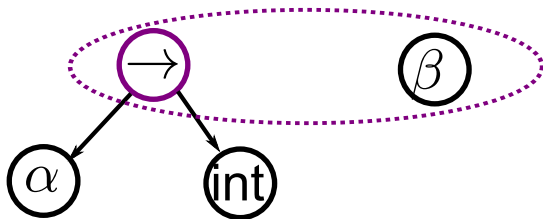
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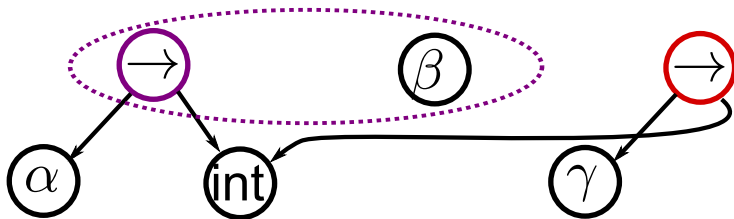
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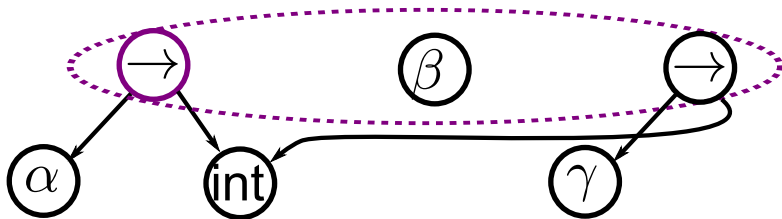
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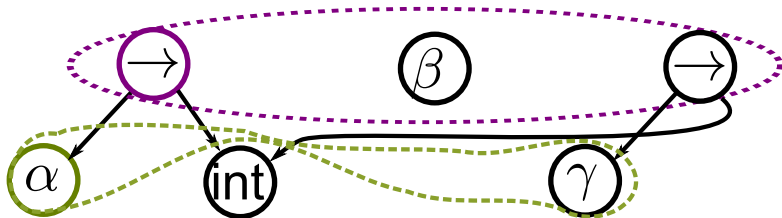
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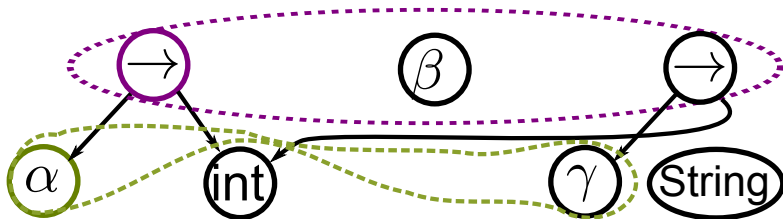
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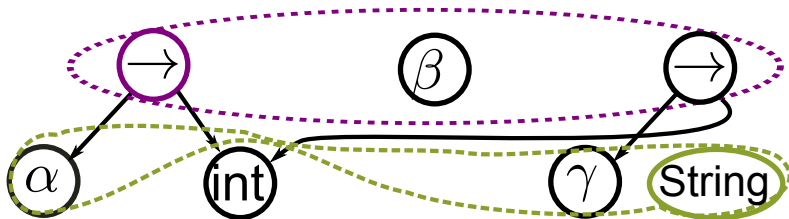
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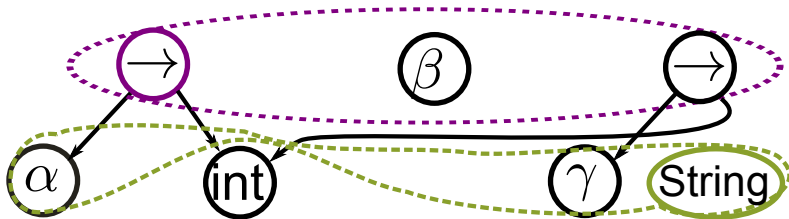
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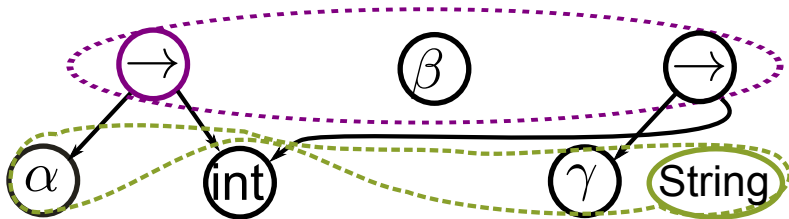
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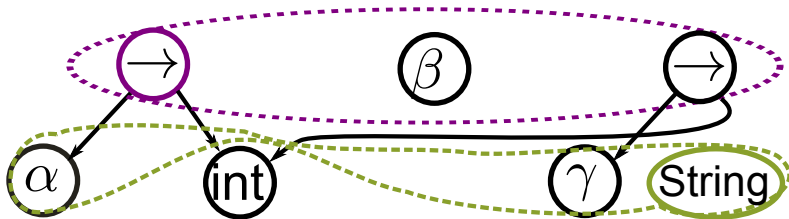
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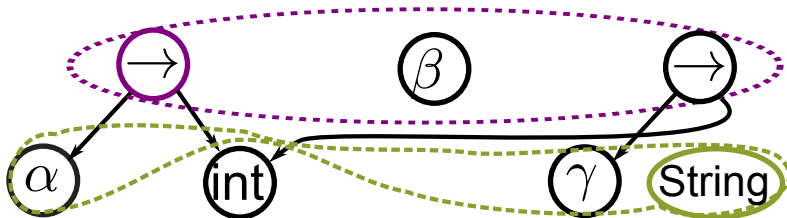
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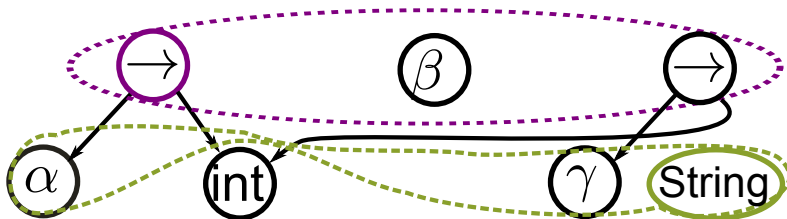
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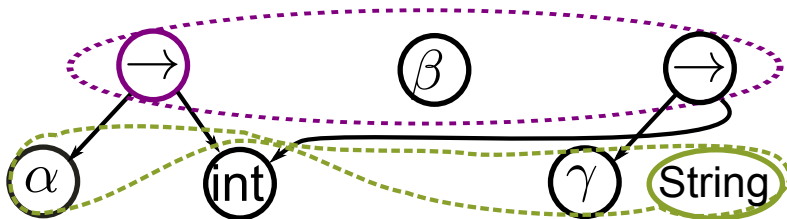
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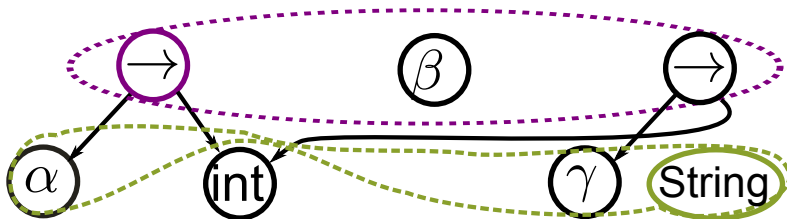
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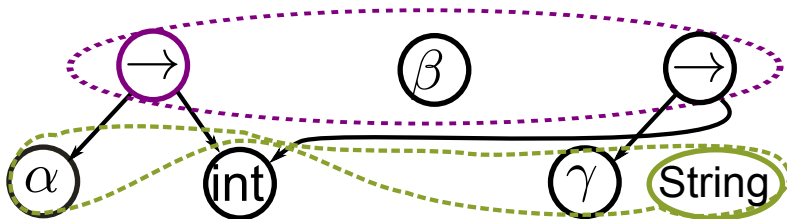
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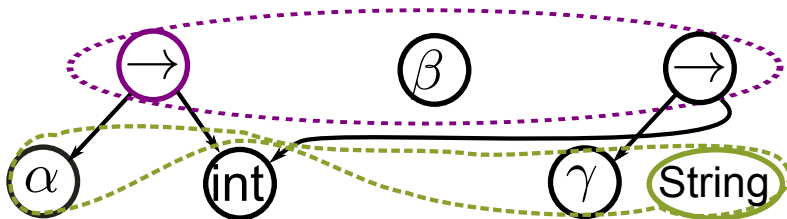
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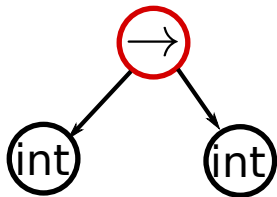
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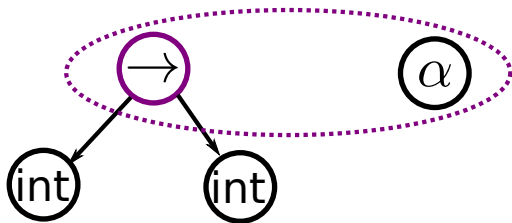


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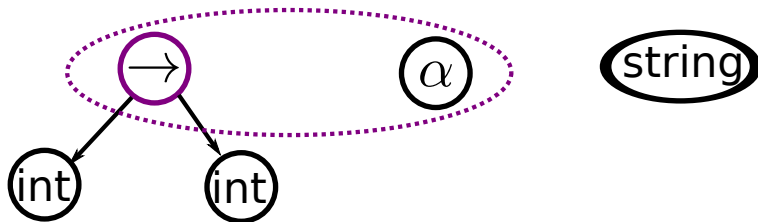


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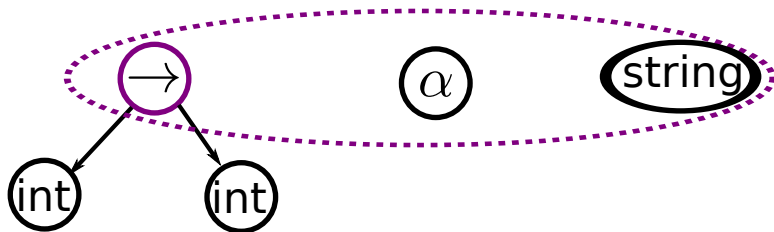


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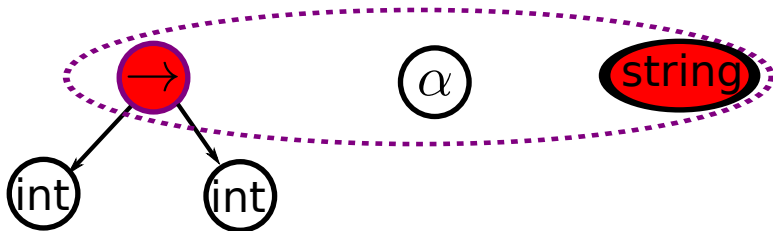


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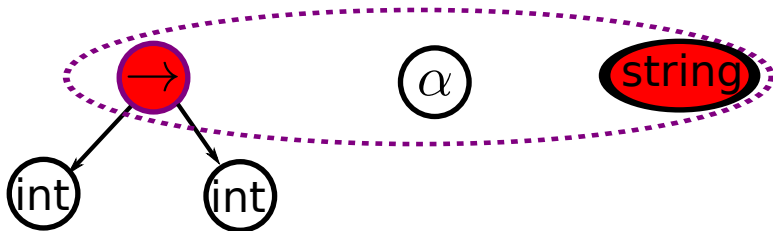


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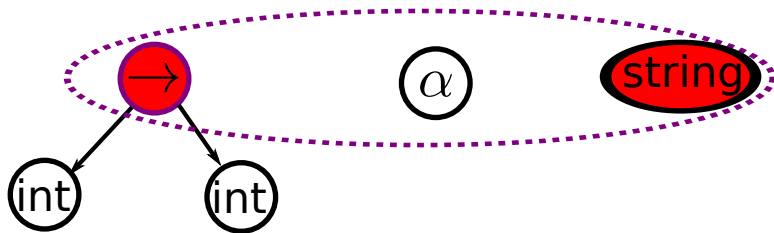
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- ▶ **Conclusion:** This system of type constraints is unsatisfiable

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- ▶ Explaining typing errors better is also an active research area!

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- ▶ In local type inference, types are only inferred within one function, but must be fully annotated at function boundaries.
- ▶ **Goal:** Make it easier for programmers to diagnose type errors (and make type inference tractable in the imperative setting)

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- ▶ Example: `edit_pair(p)` instead of `edit_pair<pair<int, string> >(p)`

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- ▶ You will see more of this in the future

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- ▶ This formulation is one of the classic and elegant results in programming languages, known as Hindley-Milner type inference
- ▶ Type inference is most likely coming to your favorite language in the near future, if it is not already there!