CS345H: Programming Languages

Lecture 13: Type Inference II

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First: Your Project

- ▶ Today is the start of your course project
- ► Goal: Take what we studied and apply it to a project you design yourself
- ► This is a team project: Teams must be between 3 and 5 students

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Possible Topics

- Your goal is to add at least one major feature to the L language
- ► Some possible examples:
 - ▶ Adding type inference to L
 - ▶ Speeding up the L interpreter
 - ▶ Adding major language features to L
 - ► Type inference with novel error reporting
 - **.** . . .
- ▶ Your creativity is the limit

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Deliverables & Time line

- ► Today: Start of project, form teams
- Nov. 13st 12:30pm: Email me a one page proposal for your project as pdf clearly describing what you want to do and list your team members
- ▶ Will receive feedback from proposal
- ▶ Dec. 11st 12:30pm : Project due. No late days.

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Final Deliverables

- ▶ Report written in LateX (at least 15 pages) describing clearly what problem you are solving, what choices you made, challenges encountered and your results.
- ▶ All your source code in a tar.gz file compiling on Ubuntu
- You will be graded on size of chosen challenge, your solution and your written report
- Since every project is unique, you will get lots of feedback throughout
- If you are passionate about a PL project not related to L, or want to tackle something especially large with more people, etc: Ask!
- ► Any questions?

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Introduction

- ▶ Recall for last time: We are inferring types
- 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

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Quick Refresher

- ► Lets quickly look again at one example: let f = lambda x.(f x) in f
- ► Type derivation:

$$\begin{split} &\Gamma[f\leftarrow a_1][x\leftarrow a_2]\vdash f:a_1\\ &\Gamma[f\leftarrow a_1][x\leftarrow a_2]\vdash x:a_2\\ &\frac{a_1=a_2\rightarrow a_3}{\Gamma[f\leftarrow a_1][x\leftarrow a_2]\vdash (f\ x):a_3}\\ &\frac{\Gamma[f\leftarrow a_1]\vdash \lambda x.(f\ x):a_1}{\Gamma\vdash \det f=\lambda x.(f\ x) \text{ in } f:a_1} \end{split}$$

- ▶ Final Type: a_1 under constraint $a_1 = a_2 \rightarrow a_3$
- ► This yielded constraint system

$$a_1 = a_2 \rightarrow a_3$$
$$a_1$$

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Solving Constraints

- ► Last time, we discussed two substitution rules that allow us to solve such constraints and find the most general solution
- However, the cost of this is quadratic in the number of constraints
- ▶ For a large program, this is prohibitive
- ▶ Today: How to efficiently solve type constraint systems

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Representing Types

- Our type constraint systems are made up of the following three primitives:
 - 1. Type constants: Int, String
 - 2. Type variables: α_1, α_2
 - 3. Function Types: $X \to Y$
- \blacktriangleright Observe that $X \to Y$ is just in-fix notation for function(X,Y)
- ightharpoonup To solve type constraints more efficiently, we will write X o Y also as function(X,Y), but this is just notation

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More Efficient Type Inference

- ▶ Big Idea: Maintain equivalence classes of types directly
- ► Equivalence Class: Set of types that must be equal
- ightharpoonup Specifically, if we process constraint of the form X=Y, we know that X and Y are equal
- $\,\blacktriangleright\,$ 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 $X_1 \to X_2$ and $Y_1 \to Y_2$, we also want to union X_1 and Y_1 as well as X_2 and Y_2

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Union-Find

- To maintain equivalence classes directly, we will use the union-find algorithm
- ► Each set of types is called an equivalence class
- ► Each set has one element as its representative
- For type inference: If an equivalence contains a type constant or a function type, we will always use this type as the representative.

Union-Find Cont.

- In Union-Find, we have only two operations on equivalence classes:
 - 1. Union(s,t): This unions the equivalence classes of s and t into one equivalence class
 - 2. Find(s): This returns the representative of the equivalence class of which s is part of
- ► Example: Assume following two equivalence classes (representatives in red): $\{int, \alpha\}, \{\beta \rightarrow \gamma, int\}$
- ▶ Example: $Union(int, \beta \to \gamma)$ results in new equivalence class $\{int, \alpha, \beta \to \gamma\}$
- ▶ Example: $Find(\alpha) = int$

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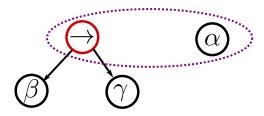
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Union-Find Representation

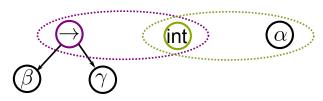
- ▶ We will represent equivalence classes as DAGs.
- ▶ Example: $\{\beta \to \gamma, \alpha\}$



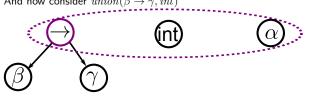
- ► Conceptually, union will join the dotted areas of two equivalence classes
- ▶ And find will return the (red) representative in this class

Union-Find Representation Cont.

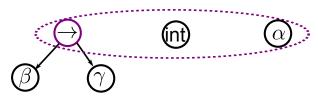
► Consider the following EQs:



And now consider $union(\beta \rightarrow \gamma, int)$



Union-Find Representation



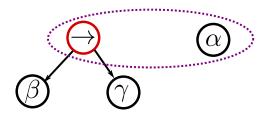
- Question: Is this a possible solution for the type constraints?
- ▶ No! If a function type and a constant type ever end up in the same equivalence class, we know that the constraint system has no solution
- We also know constraint system has no solution if Int and String end up in the same EQ

Finding a Solution from the Union-Find DAG

- Assuming we end up with an consistent Union-find DAG, we can read the most general solution right of!
- For each type variable v, simply return find(v)
- ▶ In other words, the representative of each equivalence class is the most general solution
- ▶ 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?

Finding a Solution from the Union-Find DAG

Example:



- ▶ 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

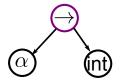
- ▶ Initially, all type variables, functions and type constants are in their own equivalence class
- ▶ We then apply the following function to each equality in our type constraint:

```
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:

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





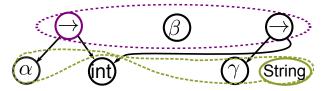


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Example Cont

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



- ▶ Solution for α : $find(\alpha) = String$
- ▶ Solution for β : $find(\beta) = String \rightarrow Int$
- ▶ Solution for γ : $find(\gamma) = String$

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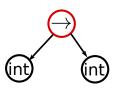
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Example 2

▶ Consider the following system of type constraints:

$$\alpha = Int \rightarrow Int$$
 $\alpha = String$







- ightharpoonup Conflict: Unify returns false when trying to unify Int
 ightarrow Int and String
- ▶ Conclusion: This system of type constraints is unsatisfiable

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Union-Find

- ► With this new approach, we can now only process each equality once.
- ► However, for this to be efficient, union/find must be efficient.
- ► Key result from algorithms: It is possible to build a data structure for union-find that can find a solution to our sets of type constraints in approximately linear time.
- ► You can learn about this data structure in Advance Algorithms or Isil's class on automated logical reasoning
- ▶ But for our purposes, we will just use this data structure

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Type Inference

- ▶ If we use Union-Find, we can make type inference practical on real programs
- ► This style of polymorphic type inference we studied is known as Hindley-Milner type inference
- ► Type inference is at the core of languages such as OCAML and Haskell
- ► Type inference is increasingly moving to main-stream languages
 - ▶ New C++11 standard
 - ▶ Java 7

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Type Inference and Errors

- We saw that we can detect all errors easily when doing type inference
- Specifically, every error resulted from unifying two equivalence classes that could not be unified.
- **Example:** Trying to unify String and $\alpha \to Int$
- ▶ But how do we report this error to programmers?

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Error Reporting

- ▶ Consider again the example: String and $\alpha \to Int$.
- ▶ Option 1: Output message: String and $\alpha \to Int$ cannot be unified.
- ► Is this helpful?
- ▶ Obvious problems:
 - Not associated with any source location
 - Understanding typing errors requires understanding type

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Error Reporting Cont.

- Improvement used in practice: Associate expression/source location with type constraint.
- ▶ Message can now at least contain the program expressions that evaluate to String and $\alpha \to Int$
- But the actual error in your program may be arbitrarily far from these locations!
- ► Typical OCaml error:

 "At line 37: Expected expression of type 'a -> 'a
 but found expression of type 'a -> 'b"
- ► To fix this, you need to understand all the reasoning steps that happened during type inference
- ▶ Most likely, the problem did not originate at line 37!

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Type Annotations

- Most common technique for mitigating these difficulties:
 Allow type annotations
- Type annotations allow you explicitly declare types even though the compiler can infer them automatically
- ► Idea: If you encounter a type error you do not understand, you give the type you expect to the expressions involved in this error and re-run the type checker
- ▶ You will now get a new type error in a different location
- ► You repeat this process until you fixed your type error

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Type Annotations Drawbacks

- ▶ However, this approach still has substantial drawbacks:
 - You often need many annotations to find the source of type errors
 - ► You can only annotate successfully if you understand polymorphic type inference
 - You often end up with a program that is almost completely type annotated!

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Type Inference in the Real World

- Despite these difficulties, there are many real languages that support full type inference.
- ► Examples: OCaml, Haskell, F#
- ► Slogan on Type Inference: The ease of dynamic typing with the speed an guarantees of a static type system
- This claim is true, but real problems with explaining typing errors to programmers
- Explaining typing errors better is also an active research area!

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Type Inference in the Real World Cont.

- Alternative approach taken by more main-stream languages recently: local type inference
- 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 of local type inference

- ▶ C++ supports some forms of local type inference.
- ► First Example: templates
- ► A STL pair is templatized over the type of the first and second element
- ► You declare a pair as: pair<int, string> p(3, "duck");
- However, if you call a function that takes a pair, the compiler will infer the template type for you in some cases:
- Example: edit_pair(p) instead of edit_pair<pair<int, string> >(p)

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Example of local type inference

- ► The new C++11 standard supports much more expressive local type inference
- ▶ This is done using the auto keyword
- Example using iterator: vector<int> v;
 ...
 for(vector<int>::iterator it = v.begin(); it !=
 v.end(); it++) ...
- Example using iterator with new auto keyword:
 vector<int> v;
 ...
 for(auto it = v.begin(); it != v.end(); it++) ...

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Type Inference in C++

- ► The auto keyword really just says "do type inference on this expression and figure the type out"
- ► Very convenient, local feature that is also creeping into languages such as C# and Java
- ▶ You will see more of this in the future

Conclusion

- ▶ We saw how to use Union-Find to make type inference scalable
- ➤ 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!

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