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Gradual Typing with Unification-based Inference

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Abstract

Static and dynamic type systems have well-known strengths and weaknesses. *Gradual typing* provides the benefits of both in a single language by giving the programmer control over which portions of the program are statically checked based on the presence or absence of type annotations.

This paper studies the combination of gradual typing and unification-based type inference, with the goal of developing a system that helps programmers increase the amount of static checking in their program. The key question in combining gradual typing and inference is how should the dynamic type of a gradual system interact with the type variables of an inference system. This paper explores the design space and shows why three straightforward approaches fail to meet our design goals. In particular, the combined system should satisfy the criteria for a gradual type system: 1) when a program is unannotated, only a few type errors are detected at compile-time and the rest are detected at run-time, and 2) when the program does not contain dynamic type annotations (implicitly or explicitly), the type system should statically detect all type errors.

This paper presents a new type system based on the idea that a solution for a type variable should be as informative as any type that constrains the variable. We prove that the new type system satisfies the above criteria for a gradual type system. The paper also develops an efficient inference algorithm and proves it sound and complete with respect to the type system.

Contents

1	Introduction	3
2	Review of Gradual Typing and Inference	4
3	Exploration of the Design Space	8
4	A Type System for $\lambda_{\rightarrow}^{?\alpha}$ 4.1 The Consistent-equal and Consistent-less Judgments	10 11 13 14
5	A Type Inference Algorithm for $\lambda_{\rightarrow}^{?\alpha}$ 5.1 Constraint Generation	15 16 16 19
6	Related Work	21
7	Conclusion	22
A	Isabelle Formalization A.1 Syntax and Auxilliary Functions	22 22
	A.1.1 Auxilliary Functions	23 25
	A.2 The Simply Typed Lambda Calculus	26 31
	A.4 The Consistency and Less Informative Relations	32
	<u> </u>	

1 Introduction

Static and dynamic typing have complementary strengths, making them better for different tasks and stages of development. Static typing, used in languages such as Standard ML [18], provides full-coverage type error detection, facilitates efficient execution (since values may remain unboxed and run-time checking of type tags is not needed), and provides machine-checked documentation that is particularly helpful for maintaining consistency when programming in the large. The main drawback of static typing is that the whole program must be well-typed before the program can be run. Typing decisions must be made for all elements of the program, even for ones that have yet to stabilize, and changes in these elements can ripple throughout the program.

In a dynamically typed language, no compile-time checking is performed. Thus, programmers need not worry about types while the overall structure of the program is still in flux. This makes dynamic languages suitable for rapid prototyping. Dynamically typed languages such as Perl, Ruby, Python, and JavaScript are popular for scripting and web applications where rapid development and prototyping is prized above other features. The problem with dynamic languages is that they forgo the benefits of static typing: there is no machine checked documentation, execution is less efficient, and errors are caught only at runtime, often after deployment.

Gradual typing, recently introduced by Siek and Taha [29], enable programmers to mix static and dynamic type checking in a program by providing a convenient way to control which parts of a program are statically checked. The defining properties of a gradual type system are:

- 1. Programmers may omit type annotations and immediately run the program; run-time type checks are performed to preserve type safety.
- 2. Programmers may add type annotations to increase static checking. When all variables are annotated, *all* type errors are caught at compile-time.

A number of researchers have further studied gradual typing over the last two years. Herman, Tomb, and Flanagan [12] developed space-efficient run-time support for gradual typing. Siek and Taha [30] integrated gradual typing with objects and subtyping. Wadler and Findler showed how to perform blame tracking and proved that the well-typed portions of a program can't be blamed [36]. Herman and Flanagan are adding gradual typing to the next version of JavaScript [11].

An important question, from both a theoretical and practical perspective, has yet to be answered: is gradual typing compatible with type inference? Type inference is common in modern functional languages and is becoming more common in mainstream languages [10, 37]. There are many flavors of type inference: Hindley-Milner inference [17], dataflow-based inference [6], Soft Typing [3], and local inference [24] to name a few. In this paper we study type inference based on unification [28], the foundation of Hindley-Milner inference and the related family of algorithms used in many functional languages [16, 18, 22].

The contributions of this paper are:

- 1. An exploration of the design space that shows why three straightforward inference approaches do not satisfy the above criteria for a gradual type system (§3). The three approaches are: 1) treat dynamic types as type variables, 2) well-typed after substitution, and 3) ignore dynamic types during unification.
- 2. A new design based on the idea that the solution for a type variable should be as informative as any type that constrains the variable (§4). We formalize this idea in a type

system ($\S4.2$) and prove that it satisfies the criteria of a gradual type system ($\S4.3$). We machine checked the proofs in Isabelle/HOL [20]. The formalization and proofs are in Appendix A.

3. An inference algorithm for the above type system (§5). We prove that the algorithm is sound and complete with respect to the type system and that the algorithm has almost linear time complexity (§5.3). The algorithm does not infer types that introduce unnecessary cast errors.

Before the main technical developments, we review gradual typing as well as traditional unification-based inference ($\S 2$). After the main body of the paper, we place our work in relation to the relevant literature ($\S 6$) and conclude ($\S 7$).

2 Review of Gradual Typing and Inference

We review gradual typing in the absence of type inference, showing examples in a hypothetical variant of Objective Caml [16] that supports gradual typing but not type inference. We then review type inference in the absence of gradual typing.

A Review of Gradual Typing The incr function listed below has a parameter x and returns x + 1. The parameter x does not have a type annotation so the gradual type system delays checks concerning x inside the incr function until run-time, just as a dynamically typed language would.

More precisely, because the parameter x is not annotated the gradual type system gives it the **dynamic type**, written? for short.

Now suppose the + operator expects arguments of type int. The gradual type system allows an implicit coercion from type? to int. This kind of coercion could fail (like a down cast) and therefore must be dynamically checked. In some statically-typed languages, such as ML, implicit coercions are forbidden; in many object-oriented languages, such as Java, implicit up-casts are allowed (they never fail) but not implicit down-casts. Allowing implicit coercions that may fail is the distinguishing feature of gradual typing and gives it the flavor of dynamic typing.

To facilitate the migration of code from dynamic to static checking, gradual typing allows for a mixture of the two and provides seamless interaction between them. In the example above, we define a variable a of type int, and invoke the dynamically typed incr function. Here the gradual type system allows an implicit coercion from int to?. This is a safe coercion—it can never fail at run-time—however the run-time system needs to remember the type of the value so that it can check the type when it casts back to int inside of incr.

Gradual typing also allows implicit coercions among more complicated types, such as function types. In the following example, the map function has a parameter f annotated with the function type (int \rightarrow int) and a parameter I with type int list.

```
let rec map (f:int\rightarrowint) (l:int list) = ...
let incr x = x + 1
let a:int = 1
map incr [1; 2; 3] (* OK *)
map a [1; 2; 3] (* compile time type error *)
```

The function call map incr [1; 2; 3] is allowed by the gradual type system, even though the type of the argument incr $(? \to int)$ differs from the type of the parameter (int $\to int$). The type system compares the two types structurally and allows the two types to differ in places where one of the types has a ?. Thus, the function call is allowed because the return types are equal and there is a ? in one of the parameter types. In contrast, map a [1; 2; 3] elicits a compile-time error because argument a has type int whereas f is annotated with a function type.

When a program is fully annotated, that is, when all the program variables are annotated with types that include no? types, the gradual type system catches at compile-time all the errors that a fully-static type system would.

More formally, the main idea of gradual typing is to replace the use of type equality with a relation called type consistency, written \sim for short. The intuition behind type consistency is to check whether the two types are equal in the parts where both types are known. The following are a few examples.

$$\begin{array}{lll} \operatorname{int} \sim \operatorname{int} & \operatorname{int} \not\sim \operatorname{bool} & ? \sim \operatorname{int} & \operatorname{int} \sim ? \\ \operatorname{int} \rightarrow ? \sim ? \rightarrow \operatorname{int} & \operatorname{int} \rightarrow ? \sim \operatorname{int} \rightarrow \operatorname{bool} \\ \operatorname{int} \rightarrow ? \not\sim \operatorname{bool} \rightarrow ? & \operatorname{int} \rightarrow \operatorname{int} \not\sim \operatorname{int} \rightarrow \operatorname{bool} \end{array}$$

The following is an inductive definition of the consistency relation. This relation is reflexive, symmetric, but not transitive.

Type Consistency

(CREFL)
$$\frac{\tau_1 \sim \tau_2 \quad \rho_1 \sim \rho_2}{\tau_1 \to \rho_1 \sim \tau_2 \to \rho_2}$$
(CDR) $\frac{\tau_1 \sim \tau_2 \quad \rho_1 \sim \rho_2}{\tau_2 \to \rho_2}$

The syntax of the gradually typed lambda calculus $(\lambda^?_{\rightarrow})$ is shown below and the type system is reproduced in Figure 1. A gradual type system uses type consistency where a simple type system uses type equality. For example, the (APP2) rule in the gradually typed lambda calculus [29] requires that the argument type τ_2 be consistent with the parameter type τ_1 .

Syntax for $\lambda^?_{\rightarrow}$

```
\begin{array}{lll} \text{Variables} & x,y & \in \mathbb{X} \\ \text{Ground Types} & \gamma & \in \mathbb{G} & \supseteq \{\mathsf{bool},\mathsf{int},\mathsf{unit}\} \\ \text{Constants} & c & \in \mathbb{C} & \supseteq \{\mathsf{true},\mathsf{false},\mathsf{succ},0,(),\mathsf{fix}[\tau]\} \\ \text{Types} & \tau & ::= & ? \mid \gamma \mid \tau \to \tau \\ \text{Expressions} & e & ::= & x \mid c \mid e \mid e \mid \lambda x \colon \tau. \; e \\ & \lambda x. \; e & \equiv & \lambda x \colon ?. \; e \end{array}
```

This type system meets both criteria for a gradual type system discussed in §1: the first because the consistency relation allows implicit coercions both to and from the dynamic type, the second because when there are no ?s in the program (either explicitly or implicitly), this type system is equivalent to a fully static type system. The consistency relation collapses to equality when there are no ?s: for any σ and τ that contain no ?s, $\sigma \sim \tau$ iff $\sigma = \tau$.

Review of Unification-based Type Inference Type inference allows programmers to omit type annotations but still enjoy the benefits of static type checking. For example, the following

$$(VAR) \qquad \frac{\Gamma(x) = \tau_1}{\Gamma \vdash_g x : \tau_1} \qquad \Gamma \vdash_g e : \tau$$

$$(CNST) \qquad \Gamma \vdash_g c : typeof(c)$$

$$(APP1) \qquad \frac{\Gamma \vdash_g e_1 : ? \qquad \Gamma \vdash_g e_2 : \tau}{\Gamma \vdash_g e_1 e_2 : ?} \qquad \Gamma \vdash_g e_1 e_2 : \tau$$

$$(APP2) \qquad \frac{\tau_1 \sim \tau_2}{\Gamma \vdash_g e_1 e_2 : \tau_3} \qquad \Gamma(x \mapsto \tau_1) \vdash_g e : \tau_2$$

$$(ABS) \qquad \frac{\Gamma(x \mapsto \tau_1) \vdash_g e : \tau_2}{\Gamma \vdash_g \lambda x : \tau_1. e : \tau_1 \to \tau_2}$$

Figure 1: The type system for $\lambda^{?}_{\rightarrow}$.

is a well-typed Objective Caml program. The inference algorithm deduces that the type of function f is int \rightarrow int.

```
# let f x = x + 1;;
val f : int \rightarrowint = \langlefun\rangle (* Output of inference *)
```

The type inference problem is formulated by attaching a type variable, an *unknown*, to each location in the program. The job of the inference algorithm is to deduce a solution for these variables that obeys the rules of the type system. So, for example, the following is the above program annotated with type variables.

let
$$f_{\alpha} \times_{\beta} = (x_{\gamma} +_{\delta} 1_{\gamma})_{\rho}$$

The inference algorithm models the rules of a type system as equations that must hold between the type variables. For example, the type β of the parameter x must be equal to the type γ of the occurrence of x in the body of f. The parameter types of + (both are int) must be equal to the argument types γ and χ , and the return type of +, also int, must be equal to ρ . Ultimately, the type α of f must be equal to the function type $\beta \to \rho$ formed from the parameter type β and the return type ρ . This set of equations can be solved by standard unification [28]. A substitution maps type variables to types and can be naturally extended to map types to types. The unification algorithm computes a substitution S such that for each equation $\tau_1 = \tau_2$, we have $S(\tau_1) = S(\tau_2)$.

A natural setting in which to formalize type inference is the simply typed lambda calculus with type variables $(\lambda^{\alpha}_{\rightarrow})$. The syntax is similar to $\lambda^{?}_{\rightarrow}$, but with type variables and no dynamic type. The standard type system for the simply typed lambda calculus [23] is reproduced in Figure 2. The extension of this type system to handle type variables, given below, is also standard [23].

Definition 1. A term e of $\lambda^{\alpha}_{\rightarrow}$ is **well-typed** in environment Γ if there is a substitution S and a type τ such that $S(\Gamma) \vdash S(e) : \tau$.

We refer to this approach to defining well-typedness for programs with type variables as well-typed after substitution.

An inference algorithm for $\lambda^{\alpha}_{\rightarrow}$ can be expressed as a two-step process [8, 23, 38] that generates a set of constraints (type equalities) from the program and then solves the set of equalities with unification. Constraint generation for $\lambda^{\alpha}_{\rightarrow}$ is defined in Figure 3. The soundness and completeness of the inference algorithm with respect to the type system has been proved in the literature [23, 38].

$$\frac{\Gamma(x) = \tau_1}{\Gamma \vdash x : \tau_1}$$

$$\Gamma \vdash c : typeof(c)$$

$$\frac{\Gamma \vdash e_1 : \tau_1 \rightarrow \tau_2 \quad \Gamma \vdash e_2 : \tau_1}{\Gamma \vdash e_1 e_2 : \tau_2}$$

$$\frac{\Gamma(x \mapsto \tau_1) \vdash e : \tau_2}{\Gamma \vdash \lambda x : \tau_1. \ e : \tau_1 \rightarrow \tau_2}$$

Figure 2: The type system of the simply typed λ -calculus.

$$\frac{\Gamma(x) = \tau}{\Gamma \vdash x : \tau \mid \{\}}$$

$$\Gamma \vdash c : typeof(c) \mid \{\}$$

$$\frac{\Gamma \vdash e_1 : \tau_1 \mid C_1}{\Gamma \vdash e_2 : \tau_2 \mid C_2 \quad (\beta \text{ fresh})}$$

$$\frac{\Gamma \vdash e_1 e_2 : \beta \mid \{\tau_1 = \tau_2 \to \beta\} \cup C_1 \cup C_2}{\Gamma(x \mapsto \tau) \vdash e : \rho \mid C}$$

$$\frac{\Gamma(x \mapsto \tau) \vdash e : \rho \mid C}{\Gamma \vdash \lambda x : \tau \cdot e : \tau \to \rho \mid C}$$

Figure 3: The definition of constraint generation for $\lambda_{\rightarrow}^{\alpha}$.

In §4 we combine inference with gradual typing and need to treat type variables with special care, but if we follow the well-typed-after-substitution approach, type variables are substituted away before the type system is consulted. As an intermediate step towards integration with gradual typing, we give an equivalent definition of well-typed terms for $\lambda^{\alpha}_{\rightarrow}$, that combines the substitution S with the type system. The type system is shown in Figure 4 and the judgment has the form S; $\Gamma \vdash e : \tau$ which reads: e is well-typed because S and τ are a solution for e in Γ .

Formally, we use the following representation for substitutions, which is common in mechanized formalizations [19].

Definition 2. A substitution is a total function from type variables to types and its **dom** consists of the variables that are not mapped to themselves. Substitutions extend naturally to types, typing environments, and expressions. The \circ operator composes two substitutions.

Theorem 1 states that the two type systems are equivalent, and relies on the following two lemmas. The function FTV returns the free type variables within a type, type environment, or expression.

Lemma 1. If $S(\Gamma) \vdash S(e) : \tau$ and S is idempotent then $S(\tau) = \tau$.

Proof. Observe that if $S(\Gamma) \vdash S(e) : \tau$ then $FTV(\tau) \cap dom(S) = \emptyset$. Furthermore, if S is idempotent then $FTV(\tau) \cap dom(S) = \emptyset$ implies $S(\tau) = \tau$.

Lemma 2. If S idempotent and $S(\tau) = \tau_1 \rightarrow \tau_2$ then $S(\tau_2) = \tau_2$.

Proof. We have
$$\tau_1 \to \tau_2 = S(\tau) = S(S(\tau)) = S(\tau_1 \to \tau_2) = S(\tau_1) \to S(\tau_2)$$
. Thus $\tau_2 = S(\tau_2)$.

$$(SVAR) \qquad \frac{\Gamma(x) = \tau}{S; \Gamma \vdash x : \tau}$$

$$(SCNST) \qquad S; \Gamma \vdash c : typeof(c)$$

$$(SAPP) \qquad \frac{S; \Gamma \vdash e_1 : \tau_1 \quad S; \Gamma \vdash e_2 : \tau_2}{S(\tau_1) = S(\tau_2 \to \tau_3)}$$

$$S; \Gamma \vdash e_1 e_2 : \tau_3$$

$$(SABS) \qquad \frac{S; \Gamma(x \mapsto \tau_1) \vdash e : \tau_2}{S; \Gamma \vdash \lambda x : \tau_1. \ e : \tau_1 \to \tau_2}$$

Figure 4: The type system for $\lambda_{\rightarrow}^{\alpha}$.

Theorem 1. The two type systems for λ^{α} are equivalent.

- 1. Suppose S is idempotent. If $S(\Gamma) \vdash S(e) : \tau$, then there is a τ' such that $S(\Gamma) \vdash e : \tau'$ and $S(\tau') = \tau$.
- 2. If $S; \Gamma \vdash e : \tau$, then $S(\Gamma) \vdash S(e) : S(\tau)$.

Proof. 1. $S(\Gamma) \vdash S(e) : \tau \Longrightarrow S(\Gamma) \vdash S(e) : S(\tau)$ by Lemma 1. We prove by induction that $S(\Gamma) \vdash S(e) : S(\tau)$ implies there is a τ' such that $S(\Gamma) \vdash e : \tau'$ and $S(\tau') = S(\tau)$. We use Lemma 1 in the (APP) case and Lemma 2 in the (ABS) case. Then using Lemma 1 once more gives us $S(\tau') = \tau$.

2. The proof is a straightforward induction on $S; \Gamma \vdash e : \tau$.

3 Exploration of the Design Space

We investigate three straightforward approaches to integrate gradual typing and type inference. In each case we give examples of programs that should be well-typed but are rejected by the approach, or that should be ill-typed but are accepted by the approach.

Dynamic Types as Type Variables A simple approach is to replace every occurrence of ? in the program with a fresh type variable and then do constraint generation and unification as presented in §2. The resulting system is fully static, not gradual. Consider the following program.

```
let z = ...
let f(x : int) = ...
let g(y : bool) = ...
let h(a : ?) = if z then f a else g(a)
```

Variable a has type? and so a fresh type variable α would be introduced for its type. The inference algorithm would deduce from the function applications f a and g a that $\alpha = \text{int}$ and $\alpha = \text{bool}$ respectively. There is no solution to these equations, so the program would be rejected with a static type error. However, the program would run without error in a dynamically typed language given an appropriate value of z and input for h. Furthermore, this program type checks in the gradual type system of Figure 1 so it ought to remain valid in the presence of type inference.

The next example exhibits a different problem: the inference algorithm may not find concrete solutions for some variables and therefore indicate polymorphism in cases where there shouldn't be.

let
$$f(x : int) (g : ? \rightarrow ?) = g x$$

Generating fresh type variables for the ?s gives us $g: \alpha \to \beta$. Let γ be the type variable for the return type of f and the type of the expression g x. The only equation constraining γ is $\gamma = \beta$, so the return type of f is inferred to be β . But if f is really polymorphic in β it should behave uniformly for any choice β [27, 35]. Suppose g is the identity function. Then f raises a cast error if $\beta = \mathsf{bool}$ but not if $\beta = \mathsf{int}$.

Ignore Dynamic Types During Unification Yet another straightforward approach is to adapt unification by simply ignoring any unification of the dynamic type with any other type. However, this results in programs with even more unsolved variables than in the approach described above. Consider again the following program.

From the function application, the inference algorithm would deduce $? \to ? = \text{int} \to \beta$, where β is a fresh variable representing the result type of the application g x. This equality would decompose to ? = int and $? = \beta$. However, if the unification algorithm does not do anything with $? = \beta$, we end up with β as an unsolved variable, giving the impression that f is parametric in β , which is certainly not the case. Some choices for β can cause runtime cast errors whereas other choices do not.

Well-typed After Substitution In §2 we presented the standard type system for $\lambda_{\rightarrow}^{\alpha}$, saying that a program is well typed if there is some substitution that makes the program well typed in λ_{\rightarrow} . We could do something similar for gradual typing, saying that a gradually typed program with variables is well typed if there exists a substitution that makes it well typed in $\lambda_{\rightarrow}^{?}$ (Figure 1).

It turns out that this approach is too lenient. Recall that to satisfy criteria 2 of gradual typing, for fully annotated programs the gradual type system should act like a static type system. Consider the following program that would not type check in a static type system because α cannot be both an int and a function.

let
$$f(g:\alpha) = g 1$$
 $f 1$

Applying the substitution $\{\alpha \mapsto ?\}$ produces a program that is well-typed in $\lambda^?$.

The next example shows a less severe problem, although it still undermines the purpose of type inference, which is to help programmers increase the amount of static typing in their programs.

```
let x:\alpha = x + 1
```

Again, the substitution $\{\alpha \mapsto ?\}$ is allowed, but it does not help the programmer. Instead, one wants to find out that $\alpha = \text{int.}$ In general, we need to be more careful about where ? is allowed as the solution for a type variable.

However, we cannot altogether disallow the use of ? in solutions because we want to avoid introducing runtime cast errors. Consider the program

$$\mathbf{let} \ f(x:?) = \\ \mathbf{let} \ y:\alpha = x \ \mathbf{in} \ y$$

Here, the *only* appropriate solution for α is the dynamic type. Any other choice introduces an implicit cast to that type, which causes a runtime cast error if the function is applied to a value whose type does not match our choice for α . Suppose we choose $\alpha = \text{int.}$ This type checks in $\lambda^?$ because int is consistent with ?, but if the function is called with a boolean argument, a runtime cast error occurs.

The problem with the well-typed-after-substitution approach is that it can "cheat" by assigning? to a type variable and thereby allow programs to type check that should not. Thus, we need to prevent the type system from adding in arbitrary?s. On the other hand, we need to allow the propagation of?s that are already in program annotations.

4 A Type System for $\lambda^{?\alpha}_{\rightarrow}$

Loosely, we say that types with more question marks are less informative. The main idea of our new type system is to require the solution for a type variable to be as informative as any type that constrains the type variable. This prevents a solution for a variable from introducing dynamic types that do not already appear in program annotations. Formally, information over types is characterized by the *less or equally informative* relation, written \sqsubseteq . This relation is just the partial order underlying the \sim relation¹. An inductive definition of \sqsubseteq is given below.

Less or Equally Informative

$$(LID) \frac{}{? \sqsubseteq \tau} \qquad (LIREFL) \frac{}{\tau \sqsubseteq \tau}$$

$$(LIFUN) \frac{\tau_1 \sqsubseteq \tau_3 \quad \tau_2 \sqsubseteq \tau_4}{\tau_1 \to \tau_2 \sqsubseteq \tau_3 \to \tau_4}$$

The \sqsubseteq relation is a partial order that forms a semi-lattice with ? as the bottom element and \sqsubseteq extends naturally to substitutions.

We revisit some examples from $\S 3$ and show how using the \sqsubseteq relation gives us the ability to separate the good programs and good solutions from the bad. Recall the following example that should be rejected but was not using the well-typed-after-substitution approach.

$$\mathbf{let} \ f (g:\alpha) = g \ 1$$

$$f \ 1$$

In our approach, the application of g to 1 introduces the constraint int $\to \beta_0 \sqsubseteq \alpha$ (where β_0 is a fresh variable generated for the result of the application) because g is being used as a function from int to β_0 . Likewise, the application of f to 1 introduces the constraint int $\to \beta_1 \sqsubseteq \alpha \to \beta_0$ which implies int $\sqsubseteq \alpha$. There is no solution to these constraints on α so the program is rejected.

In the next example, the only solution for α should be int.

let
$$x:\alpha = x + 1$$

Indeed, in our approach we have the constraint int $\sqsubseteq \alpha$ whose only solution is $\alpha = \text{int.}$ In the third example, the type system should allow $\alpha = ?$ as a solution.

¹ Each relation is definable in terms of the other: we have $\tau_1 \sim \tau_2$ iff there is a τ_3 such that $\tau_1 \sqsubseteq \tau_3$ and $\tau_2 \sqsubseteq \tau_3$, and in the other direction, $\tau_1 \sqsubseteq \tau_2$ iff for any τ_3 , $\tau_2 \sim \tau_3$ implies $\tau_1 \sim \tau_3$.

$$\mathbf{let} \ f \ (x:?) = \\ \mathbf{let} \ y:\alpha = x \ \mathbf{in} \ y$$

Indeed, we have the constraint ? $\sqsubseteq \alpha$, which allows $\alpha = ?$ as a solution. In this case the type system allows many solutions, some of which, as discussed in §3 may introduce unnecessary casts. In our design, the inference algorithm is responsible for choosing a solution that does not introduce unnecessary casts. It will do this by choosing the least informative solution allowed by the type system. This means the inference algorithm chooses the least upper bound of all the types that constraint a type variable as the solution for that variable.

The following program further illustrates how the \sqsubseteq relation constrains the set of valid solutions.

let f (g:?
$$\rightarrow$$
int) (h:int \rightarrow ?) = ... **let** k (y: α) = f y y

The parameter y is annotated with type variable α and is used in two places, one that expects $? \to \mathsf{int}$ and the other that expects $\mathsf{int} \to ?$. So we have the constraints $? \to \mathsf{int} \sqsubseteq \alpha$ and $\mathsf{int} \to ? \sqsubseteq \alpha$, whose only solution is $\alpha = \mathsf{int} \to \mathsf{int}$.

Constraints on type variables can also arise from constraints on compound types that contain type variables. For example, in the following program, we need to delve under the function type to uncover the constraint that int $\sqsubseteq \alpha$.

let g (f:int
$$\rightarrow$$
int) = f 1
let h (f: $\alpha \rightarrow \alpha$) = g f

In the next subsection we define how this works in our type system.

4.1 The Consistent-equal and Consistent-less Judgments

To formalize the notions of constraints between arbitrary types, we introduce two judgments: consistent-equal, which has the form $S \models \tau \simeq \tau$ and consistent-less, which has the form $S \models \tau \sqsubseteq \tau$. The two judgments are defined in Figure 5. The consistent-equal judgment is similar to the type consistency relation \sim except that \simeq gives special treatment to variables. When a variable occurs on either side of the \simeq , the substitution for that variable is required to produce a type that is as informative as the other type according to the consistent-less judgment. The consistent-less judgment is similar to the \sqsubseteq relation except that it also gives special treatment to variables. When a variable appears on the left, the substitution for that variable is required to be equal to the type on the right. (There is some asymmetry in the $S \models \tau \sqsubseteq \tau$ judgment. The substitution is applied to type of the left and not the right because the substitution has already been applied to the type on the right.)

We illustrate the rules for consistent-equal and consistent-less with the following example.

$$S \models \mathsf{int} \to \alpha \simeq ? \to (\beta \to (\mathsf{int} \to ?))$$

What choices for S satisfies the above constraint? Applying the inverse of the (CEFun) rule we have

$$S \models \mathsf{int} \simeq ?, \ S \models \alpha \simeq \beta \to (\mathsf{int} \to ?)$$

The first constraint is satisfied by any substitution using rule (CEDR), but the second constraint is satisfied when

$$S \models \beta \rightarrow (\mathsf{int} \rightarrow ?) \sqsubseteq S(\alpha)$$

$$(CEG) \qquad \overline{S \models \gamma \simeq \gamma} \qquad \boxed{S \models \tau \simeq \tau}$$

$$(CEDL/R) \qquad \overline{S \models \tau \simeq \tau} \qquad \overline{S \models \tau \simeq \tau}$$

$$(CEFUN) \qquad \overline{S \models \tau_1 \simeq \tau_3} \qquad S \models \tau_2 \simeq \tau_4$$

$$S \models \tau_1 \to \tau_2 \simeq \tau_3 \to \tau_4$$

$$(CEVL/R) \qquad \overline{S \models \tau \sqsubseteq S(\alpha)} \qquad \overline{S \models \tau \sqsubseteq S(\alpha)}$$

$$S \models \alpha \simeq \tau \qquad \overline{S \models \tau \sqsubseteq S(\alpha)} \qquad \overline{S \models \tau \simeq \alpha}$$

$$(CLVAR) \qquad \overline{S \models \alpha \sqsubseteq \tau} \qquad \overline{S \models \tau \sqsubseteq \tau}$$

$$(CLG) \qquad \overline{S \models \gamma \sqsubseteq \gamma}$$

$$(CLG) \qquad \overline{S \models \gamma \sqsubseteq \tau}$$

$$(CLDL) \qquad \overline{S \models \tau_1 \sqsubseteq \tau_3} \qquad S \models \tau_2 \sqsubseteq \tau_4$$

$$\overline{S \models \tau_1 \to \tau_2 \sqsubseteq \tau_3 \to \tau_4}$$

Figure 5: The consistent-equal and consistent-less judgments.

using rule (CEVL). There are many choices for α , but whichever choice is made restricts the choices for β . Suppose

$$\{\alpha \mapsto (? \to \mathsf{bool}) \to (\mathsf{int} \to \mathsf{bool})\} \subseteq S$$

Then we have

$$S \models \beta \rightarrow (\mathsf{int} \rightarrow ?) \sqsubseteq (? \rightarrow \mathsf{bool}) \rightarrow (\mathsf{int} \rightarrow \mathsf{bool})$$

and applying the inverse of (CLFun) yields

$$S \models \beta \sqsubseteq ? \rightarrow \mathsf{bool}, \ S \models \mathsf{int} \rightarrow ? \sqsubseteq \mathsf{int} \rightarrow \mathsf{bool}$$

The second constraint is satisfied by any substitution using (CLFun), (CLG), and (CLDL), but the first constraint is only satisfied when

$$S(\beta) = (? \rightarrow \mathsf{bool})$$

according to rule (CLVAR).

A key property of the $\cdot \models \cdot \simeq \cdot$ judgment is that it allows the two types to differ with respect to ?, but if both sides are variables, then their solutions must be equal, i.e., if $S \models \alpha \simeq \beta$ then $S(\alpha) = S(\beta)$. This is why $\{\alpha \mapsto \mathsf{int}\}$ is a solution for the following program but $\{\alpha \mapsto \mathsf{?}\}$ is not.

$$\mathbf{let} \ \mathsf{f}(\mathsf{x}:\alpha) = \\ \mathbf{let} \ \mathsf{y}:\beta = \mathsf{x} \ \mathbf{in} \ \mathsf{y} + 1$$

Proposition 1. (Properties of $S \models \tau \simeq \tau$ and $S \models \tau \sqsubseteq \tau$)

- 1. $S \models \tau_1 \sqsubseteq \tau_2 \text{ and } S \models \tau_3 \sqsubseteq \tau_2 \text{ implies } S \models \tau_1 \simeq \tau_3$.
- 2. Suppose τ_1 and τ_3 do not contain ?s. Then $S \models \tau_1 \sqsubseteq \tau_2$ and $S \models \tau_1 \simeq \tau_3$ implies $S \models \tau_3 \sqsubseteq \tau_2$.

- 3. If τ_1 and τ_2 contain no ?s and $S \models \tau_1 \simeq \tau_2$, $S(\tau_1) = S(\tau_2)$.
- 4. If τ_1 contains no ?s and $S \models \tau_1 \sqsubseteq \tau_2$, $S(\tau_1) = \tau_2$.
- 5. If $S \models \tau_1 \simeq \tau_2 \to \beta$, then either $\tau_1 = ?$ or there exist τ_{11} and τ_{12} such that $\tau_1 = \tau_{11} \to \tau_{12}$, $\tau_{11} \sim S(\tau_2)$, and $\tau_{12} \sqsubseteq S(\beta)$.
- 6. If $FTV(\tau_1) = \emptyset$ and $FTV(\tau_2) = \emptyset$, $S \models \tau_1 \simeq \tau_2$ iff $\tau_1 \sim \tau_2$.
- 7. If $FTV(\tau_1) = \emptyset$, then $S \models \tau_1 \sqsubseteq \tau_2$ iff $\tau_1 \sqsubseteq \tau_2$.

4.2 The Definition of the Type System

We formalize our new type system in the setting of the gradually typed lambda calculus with the addition of type variables $(\lambda_{\rightarrow}^{?\alpha})$. As in $\lambda_{\rightarrow}^{?}$, a parameter that is not annotated is implicitly annotated with the dynamic type. This favors programs that are mostly dynamic. When a program is mostly static, it would be beneficial to instead interpret variables without annotations as being annotated with unique type variables. This option can easily be offered as a command-line compiler flag.

With the consistent-equal judgment in hand we are ready to define the type system for $\lambda^{?\alpha}_{\rightarrow}$ with the judgment $S; \Gamma \vdash_g e : \tau$, shown in Figure 6. The crux of the type system is the application rule (GAPP). We considered a couple of alternatives before arriving at this rule. First we tried to borrow the (SAPP) rule of $\lambda^{\alpha}_{\rightarrow}$ (Figure 4) but replace $S(\tau_1) = S(\tau_2 \rightarrow \tau_3)$ with $S \models \tau_1 \simeq \tau_2 \rightarrow \tau_3$:

$$S; \Gamma \vdash_g e_1 : \tau_1 \qquad S; \Gamma \vdash_g e_2 : \tau_2 \qquad S \models \tau_1 \simeq \tau_2 \to \tau_3$$
$$S; \Gamma \vdash_q e_1 e_2 : \tau_3$$

This rule is too lenient: τ_3 may be instantiated with? which allows too many programs to type check. Consider the following program.

$$\lambda f: \mathsf{int} \to \mathsf{int}. \ \lambda g: \mathsf{int} \to \mathsf{bool}. \ f(g\ 1)$$

The following is a derivation for this program. The problem is that the application $(g\ 1)$ can be given the type? because $\{\} \models \mathsf{int} \to \mathsf{bool} \simeq \mathsf{int} \to ?$. Let Γ_0 and Γ_1 be the environments defined as follows.

$$\Gamma_0 = \{ f : \mathsf{int} \to \mathsf{int} \}$$

$$\Gamma_1 = \Gamma_0(g \mapsto (\mathsf{int} \to \mathsf{bool}))$$

Then we have

The second alternative we explored was to borrow the (APP1) and (APP2) rules from $\lambda^?_{\rightarrow}$, replacing $\tau_1 \sim \tau_2$ with $S \models \tau_1 \simeq \tau_2$.

$$\frac{S;\Gamma \vdash_g e_1:? \quad S;\Gamma \vdash_g e_2:\tau}{S;\Gamma \vdash_g e_1 e_2:?}$$

$$S;\Gamma \vdash_g e_1:\tau_1 \to \tau_3 \quad S;\Gamma \vdash_g e_2:\tau_2 \quad S \models \tau_1 \simeq \tau_2$$

$$S;\Gamma \vdash_g e_1 e_2:\tau_3$$

$$(GVAR) \qquad \frac{\Gamma(x) = \tau_1}{S; \Gamma \vdash_g x : \tau_1} \qquad S; \Gamma \vdash_g e : \tau$$

$$(GCNST) \qquad S; \Gamma \vdash_g c : typeof(c)$$

$$(GAPP) \qquad \frac{S; \Gamma \vdash_g e_1 : \tau_1 \quad S; \Gamma \vdash_g e_2 : \tau_2}{S \models \tau_1 \simeq \tau_2 \to \beta \quad (\beta \text{ fresh})} \qquad S; \Gamma \vdash_g e_1 e_2 : \beta$$

$$(GABS) \qquad \frac{S; \Gamma(x \mapsto \tau_1) \vdash_g e : \tau_2}{S; \Gamma \vdash_g \lambda x : \tau_1. \ e : \tau_1 \to \tau_2}$$

Figure 6: The type system for $\lambda^{?\alpha}$.

This alternative also accepts too many programs. Consider the following erroneous program: $((\lambda x : \alpha. (x \ 1)) \ 1)$. With the substitution $\{\alpha \mapsto ?\}$ this program is well-typed using the first application rule for both applications.

The problem with both of the above approaches is that they allow the type of an application to be ?, thereby adding an extra ? that was not originally in the program. We can overcome this problem by leveraging the definition of the \simeq judgment, particularly with respect to how it treats type variables: it does not allow the solution for a variable to contain more ?s than the types that constrain it. With this intuition we define the (GAPP) rule as follows.

$$(GAPP) \qquad \frac{S; \Gamma \vdash_{g} e_{1} : \tau_{1} \quad S; \Gamma \vdash_{g} e_{2} : \tau_{2}}{S \models \tau_{1} \simeq \tau_{2} \to \beta \quad (\beta \text{ fresh})}$$
$$S; \Gamma \vdash_{g} e_{1} e_{2} : \beta$$

The type of the application is expressed using a type variable instead of a metavariable. This subtle change places a more strict requirement on the variable.

Let us revisit the previous examples and show how this rule correctly rejects them. For the first example

$$\lambda f: \mathsf{int} \to \mathsf{int}. \ \lambda g: \mathsf{int} \to \mathsf{bool}. \ f(g \ 1)$$

we have the constraint set

$$\{ \text{int} \rightarrow \text{bool} \simeq \text{int} \rightarrow \beta_1, \text{ int} \rightarrow \text{int} \simeq \beta_1 \rightarrow \beta_2 \}$$

which does not have a solution because β_1 must be the upper bound of int and bool but there is no such upper bound. The second example, $((\lambda x : \alpha. (x \ 1)) \ 1)$, gives rise to the following set of constraints

$$\{\alpha \simeq \text{int} \to \beta_1, \ \alpha \to \beta_1 \simeq \text{int} \to \beta_2\}$$

which does not have a solution because α would have to be the upper bound of int $\rightarrow \beta_1$ and int.

4.3 Properties of the Type System for $\lambda_{\rightarrow}^{?\alpha}$

When there are no type variable annotations in the program, the type system for $\lambda^{?\alpha}_{\rightarrow}$ is sound with respect to $\lambda^?_{\rightarrow}$.

Theorem 2. Suppose $FTV(\Gamma) = \emptyset$ and $FTV(e) = \emptyset$. If $S; \Gamma \vdash_g e : \tau$, then $\exists \tau'$. $\Gamma \vdash_g e : \tau'$ and $\tau' \sqsubseteq S(\tau)$.

Proof. The proof is by induction on the typing derivations.

The type system for $\lambda_{\rightarrow}^{?\alpha}$ is stronger (accepts strictly fewer programs) than the alternative type system that says there must be a substitution S that makes the program well-typed in $\lambda_{\rightarrow}^{?}$ (Figure 1).

Theorem 3.

- 1. If $S; \Gamma \vdash_g e : \tau$ then there is a τ' such that $S(\Gamma) \vdash_g S(e) : \tau'$ and $\tau' \sqsubseteq S(\tau)$.
- 2. If $S(\Gamma) \vdash_g S(e) : \tau$ then it is not always the case that there is a τ' such that $S; \Gamma \vdash_g e : \tau'$.

Proof. 1. The proof is by induction on the derivation of $S; \Gamma \vdash_g e : \tau$. The case for (GAPP) uses Proposition 1, items 2 and 5.

2. Here is a counter example: $(\lambda x : \alpha . x 1) 1$.

When there are no ?s in the program, a well-typed $\lambda^{?\alpha}_{\to}$ program is also well-typed in the completely static type system of λ^{α}_{\to} . The contrapositive of this statement says that $\lambda^{?\alpha}_{\to}$ catches all the type errors that are caught by λ^{α}_{\to} .

Theorem 4. If $e \in \lambda^{\alpha}_{\rightarrow}$ and $(\forall \alpha. \Gamma(\alpha) = \tau \Longrightarrow \tau \in \lambda^{\alpha}_{\rightarrow})$ then $S; \Gamma \vdash_g e : \tau$ implies $S; \Gamma \vdash_e e : \tau$ and $\tau \in \lambda^{\alpha}_{\rightarrow}$.

Proof. The proof is by induction on the derivation of $S; \Gamma \vdash_g e : \tau$. The case for (GAPP) uses Proposition 1 item 3.

5 A Type Inference Algorithm for $\lambda^{?\alpha}_{\rightarrow}$

The inference algorithm we develop for $\lambda^{?\alpha}_{\rightarrow}$ follows a similar outline to that of the algorithm for $\lambda^{\alpha}_{\rightarrow}$ we presented in Section 2. We generate a set of constraints from the program and then solve the set of constraints. The main difference is that we generate \simeq constraints instead of type equalities, which requires changes to the constraint solver (the unification algorithm).

The classic unification algorithm is not suitable for solving \simeq constraints. Suppose we have the constraint $\{\alpha \to \alpha \simeq ? \to \text{int}\}$. The unification algorithm would first unify α and ? and substitute ? for α on the other side of the \to . But ? is not a valid solution for α according to the consistent-equal relation: it is not the case that int \sqsubseteq ?. The problem with the classic unification algorithm is that it treats the first thing that unifies with a variable as the final solution and eagerly applies substitution. To satisfy the \simeq relation, the solution for a variable must be an upper bound of *all* the types that unify with the variable.

The main idea of our new algorithm is that for each type variable α we maintain a type τ that is a lower bound on the solution of α (i.e. $\tau \sqsubseteq \alpha$). (In contrast, inference algorithms for subtyping maintain both lower and upper bounds [26].) When we encounter another constraint $\alpha \simeq \tau'$, we move the lower bound up to be the least upper bound of τ and τ' . This idea can be integrated with some care into a unification algorithm that does not rely on substitution. The algorithm we present is a variant of Huet's almost linear algorithm [13, 15]. We could have adapted Paterson and Wegman's linear algorithm [21] at the expense of a more detailed and less clear presentation.

$$\begin{array}{ccc} \Gamma(x) = \tau_1 & & & & \\ \hline \Gamma \vdash_g x : \tau_1 \mid \{\} & & & \\ \hline \Gamma \vdash_g e : \tau \mid C \\ \\ \text{(CCnst)} & & & & \\ \hline \Gamma \vdash_g e_1 : \tau_1 \mid C_1 & & \\ \hline \Gamma \vdash_g e_2 : \tau_2 \mid C_2 & & \\ \hline C_3 = \{\tau_1 \simeq \tau_2 \to \beta\} \cup C_1 \cup C_2 \\ \hline \Gamma \vdash_g e_1 e_2 : \beta \mid C_3 & & \\ \hline (\beta \text{ fresh}) & & \\ \hline \end{array}$$
 (CAbs)
$$\begin{array}{c} \hline \Gamma(x \mapsto \tau) \vdash_g e : \rho \mid C \\ \hline \hline \Gamma \vdash_g \lambda x : \tau. \ e : \tau \to \rho \mid C \\ \hline \end{array}$$

Figure 7: The definition of constraint generation for $\lambda^{?\alpha}_{\rightarrow}$.

5.1 Constraint Generation

The constraint generation judgment has the form $\Gamma \vdash_g e : \tau \mid C$, where C is the set of constraints. The constraint generation rules are given in Figure 7 and are straightforward to derive from the type system (Figure 6). The main change is that the side condition on the (GAPP) rule becomes a generated constraint on the (CAPP) rule. The meaning of a set of these constraints is given by the following definition.

Definition 3. A set of constraints C is **satisfied** by a substitution S, written $S \models C$, iff for any $\tau_1 \simeq \tau_2 \in C$ we have $S \models \tau_1 \simeq \tau_2$.

We use one of the previous examples to illustrate constraint generation and, in the next subsection, constraint solving.

$$\lambda f: (? \to \mathsf{int}) \to (\mathsf{int} \to ?) \to \mathsf{int}. \ \lambda y: \alpha. \ f \ y \ y$$

We generate the following constraints from this program.

$$\{(? \to \mathsf{int}) \to (\mathsf{int} \to ?) \to \mathsf{int} \simeq \alpha \to \beta_1, \beta_1 \simeq \alpha \to \beta_2\}$$

Because of the close connection between the type system and constraint generation, it is straightforward to show that the two are equivalent.

Lemma 3. Given that $\Gamma \vdash e : \tau \mid C$, $S \models C$ is equivalent to $S; \Gamma \vdash_q e : \tau$.

Proof. Both directions are proved by induction on the derivation of the constraint generation.

5.2 Constraint Solver

Huet's algorithm uses a graph representation for types. For example, the type $\alpha \to (\alpha \to \text{int})$ is represented as the node u in the following graph.



16

Huet used a graph data structure that conveniently combines node labels and out-edges, called the "small term" approach [13, 25]. Each node is labeled with a type, but the type is small in that it consists of either a ground type such as int or a function type (\rightarrow) whose parameter and return type are nodes instead of types. For example, the above graph is represented by the following stype function from nodes to shallow types.

$$\mathsf{stype}(u) = v \to w \quad \mathsf{stype}(v) = \mathsf{var}$$

 $\mathsf{stype}(w) = v \to x \quad \mathsf{stype}(x) = \mathsf{int}$

We sometimes write the stype of a node as a subscript, such as $u_{v\to w}$ and x_{int} . Also, when the identity of a node is not important we sometimes just write the stype label in place of the node (e.g., int instead of x_{int}).

Huet's algorithm uses a union-find data structure [31] to maintain equivalence classes among nodes. The operation find(u) maps node u to its representative node and performs path compression to speed up later calls to find. The operation union(u,v,f) merges the classes of u and v. If the argument to f is true then u becomes the representative of the merged class. Otherwise, the representative is chosen based on which class contains more elements, to reduce time complexity.

The definition of our solve algorithm is in Figure 8. We defer discussion of the $copy_dyn$ used on the first line. In each iteration of the algorithm we remove a constraint from C, map the pair of nodes x and y to their representatives u and v, and then perform case analysis on the small types of u and v. In each case we merge the equivalence classes for the two nodes and possibly add more constraints. The main difference from Huet's algorithm is some special handling of ?s. When we merge two nodes, we need to decide which one to make the representative and thereby decide which label overrides the other. In Huet's algorithm, a type variable (here nodes labeled var) is overridden by anything else. To handle ?s, we use the rules that ? overrides var but is overridden by anything else. Thus, ? nodes are treated like type variables in that they may merge with any other type. But they are not exactly like type variables in that they override normal type variables. These rules are carried out in cases 3 and 4 of the algorithm.

Before discussing the corner cases of the algorithm (copy_dyn and case 2), we apply the algorithm to the running example introduced in Section 5.1. Figure 9 shows a sequence of snapshots of the solver. Snapshot (a) shows the result of converting the generated constraints to a graph. Constraints are represented as undirected double-lines. At each step, we use bold double-lines to indicate the constraints that are about to be eliminated. To get from (a) to (b) we decompose the constraint between the two function types. Nodes that are no longer the representative of their equivalence class are not shown in the graph. Next we process the two constraints on the left, both of which connect a variable to a function type. The function type becomes the representative in both cases, giving us snapshot (c). As before we decompose a constraint between the two function types into constraints on their children and we have snapshot (d). We first merge the variable node for β_2 into the int node to get (e) and then decompose the constraint between the function type nodes into two more constraints in (f). Here we have constraints on nodes labeled with the ? type. In both cases the node labeled int overrides ? and becomes the representative. The final state is shown in snapshot (g), from which the solutions for the type variables can be read off. As expected, we have $\alpha = \text{int} \rightarrow \text{int}$.

Case 2 of the algorithm, for $? \simeq v_1 \to v_2$, deserves some explanation. Consider the program $(\lambda f : ?. \lambda x : \alpha. f x)$. The set of constraints generated from this is $\{? \simeq \alpha \to \beta\}$. According to the operational semantics from Siek and Taha [29], f is cast to $? \to ?$, so in some sense, we really should have the constraint $? \to ? \simeq \alpha \to \beta$. To simulate this in the algorithm we insert two constraints: $? \simeq v_1$ and $? \simeq v_2$. Now, some care must be taken to prevent infinite loops. Consider the constraint $? \simeq v$ where $stype(v) = v \to v$. The two new constraints are identical

```
solve(C) =
   C := \mathsf{copy\_dyn}(C)
   {f for} each node u {f do}
      u.\mathsf{contains\_vars} := \mathsf{true}
   end for
   while not C.empty() do
      x \simeq y := C.\mathsf{pop}()
      u := find(x); v := find(y)
      if u \neq v then
         (u, v, f) := \operatorname{order}(u, v)
         union(u, v, f)
         case stype(u) \simeq stype(v) of
              u_1 \rightarrow u_2 \simeq v_1 \rightarrow v_2 \Rightarrow (* case 1 *)
                   C.\mathsf{push}(u_1,v_1); C.\mathsf{push}(u_2,v_2)
             |u_1 \rightarrow u_2 \simeq ? \Rightarrow (* case 2 *)
                   if u.contains_vars then
                       u.\mathsf{contains\_vars} := \mathsf{false}
                       w_1 = \text{new\_vertex(stype=?, contains\_vars=false)}
                       w_2 = \text{new\_vertex(stype=?, contains\_vars=false)}
                       C.\mathsf{push}(w_1 \simeq u_1); C.\mathsf{push}(w_2 \simeq u_2)
             \mid \tau \simeq \text{var} \mid \tau \simeq ? \Rightarrow (* \text{ pass, case 3 and 4 } *)
             | \gamma \simeq \gamma \Rightarrow (* pass, case 5 *)
             | \_ \Rightarrow error: inconsistent types (* case 6 *)
   end while
   G = the quotient of the graph by the equivalence classes
   if G is acyclic then
      return \{u \mapsto \mathsf{stype}(\mathsf{find}(u)) \mid u \text{ a node in the graph}\}
   else error
order(u,v) = case \ stype(u) \simeq stype(v) \ of
                    |? \simeq \alpha \Rightarrow (u, v, \mathsf{true})
                    |? \simeq \tau | \alpha \simeq \tau \Rightarrow (v, u, \mathsf{true})
                     \mid \tau \simeq \alpha \mid \tau \simeq ? \Rightarrow (u, v, \mathsf{true})
                     | \  \  \Rightarrow (u, v, \mathsf{false})
```

Figure 8: The constraint solving algorithm.

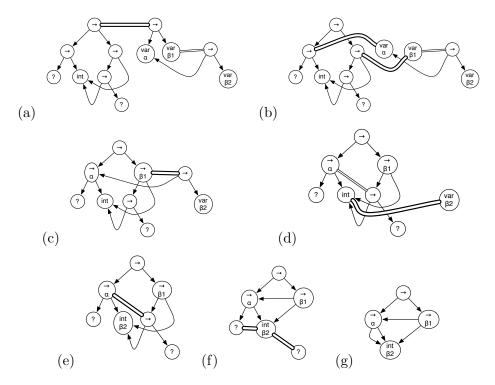


Figure 9: An example run of the constraint solver.

to the original. To avoid this problem we mark each node to indicate whether it may contain a variable. The flags are initialized to true and when we see the constraint ? $\simeq v$ we change the flag to false.

The copy_dyn function replaces each node labeled ? with a new node labeled ?, thereby removing any sharing of ? nodes. This is necessary to allow certain programs to type check, such as the example in Section 3 with the functions f, g, and h. The following is a simplified example that illustrates the same problem.

$$\lambda f: \mathsf{int} \to \mathsf{bool} \to \mathsf{int}. \ \lambda x:?. \ f \ x \ x$$

From this program we get the constraint set

$$\{\mathsf{int} \to \mathsf{bool} \to \mathsf{int} \simeq u_? \to v, \ v \simeq u_? \to w\}$$

If we forgo the copy_dyn conversion and just run the solver, we ultimately get int $\simeq u_?$ and bool $\simeq u_?$ which will result in an error. With the copy_dyn conversion, the two occurrences of $u_?$ are replaced by separate nodes that can separately unify with int and bool and avoid the error. It is important that we apply the copy_dyn conversion to the generated constraints and not to the original program, as that would not avoid the above problem.

The infer function, defined in the following, is the overall inference algorithm, combining constraint generation and solving.

Definition 4. (Inference algorithm) Given Γ and e, let τ , C, and S be such that $\Gamma \vdash e : \tau \mid C$ and $S = \mathsf{solve}(C)$. Then $\mathsf{infer}(\Gamma, e) = (S, S(\tau))$.

5.3 Properties of the inference algorithm

The substitution S returned from the solver is not idempotent. It can be turned into an idempotent substitution by applying it to itself until a fixed point is reached, which we denote

by S^* . Note that the solution S' returned by solve is less or equally informative than the other solutions, thereby avoiding types that would introduce unnecessary cast errors.

Lemma 4. (Soundness and completeness of the solver)

- 1. If S = solve(C) then $S^* \models C$.
- 2. If $S \models C$ then $\exists S'R$. $S' = \mathsf{solve}(C)$ and $R \circ S'^* \sqsubseteq S$.

Proof. The correctness of the algorithm is based on the following invariant. Let C be the original set of constraints and C' the set of constraints at a given iteration of the algorithm. At each iteration of the algorithm, $S \models C$ if an only if

- 1. $S \models C'$,
- 2. for every pair of type variables α and β in the same equivalence class, $S(\alpha) = S(\beta)$, and
- 3. there is an R such that $R \circ S' \sqsubseteq S$, where S' is the current solution based on the stype and union-find data structures.

When the algorithm starts, C = C', so the invariant holds trivially. The invariant is proved to hold at each step by case analysis. Once the algorithm terminates, we read off the answer based on the **stype** and the union-find data structure. This gives a solution that is less informative but more general (in the Hindley-Milner sense) than any other solution, expressed by the clause $R \circ S'^* \sqsubseteq S$.

Lemma 5. The time complexity of the solve algorithm is $O(m\alpha(n))$, where n is the number of nodes and m is the number of edges.

Proof. The number of iterations in the solve algorithm is O(m). In case 1 of the algorithm we push two constraints into C and make the v node and its two out-edges inaccessible from the find operation. In case 2 of the algorithm, we push two constraints into C and we mark the function type node as no-longer possibly containing variables, which makes it and its two out-edges inaccessible to subsequent applications of case 2. Each iteration performs union-find operations, which have an amortized cost of $\alpha(n)$ [31], so the overall time complexity is $O(m\alpha(n))$.

Theorem 5. (Soundness and completeness of inference)

- 1. If $(S, \tau) = \operatorname{infer}(\Gamma, e)$, then $S^*; \Gamma \vdash_q e : \tau$.
- 2. If $S; \Gamma \vdash_g e : \tau$ then there is a $S', \tau',$ and R such that $(S', \tau') = \mathsf{infer}(\Gamma, e), R \circ S'^* \sqsubseteq S,$ and $R \circ S'^*(\tau') \sqsubseteq S(\tau)$.

Proof. Let τ' and C be such that $\Gamma \vdash e : \tau' | C$.

- 1. By the soundness of solve (Lemma 4) we have $S^* \models C$. Then by the equivalence of constraint generation and the type system (Lemma 3), we have S^* ; $\Gamma \vdash e : \tau$.
- 2. By the equivalence of constraint generation and the type system (Lemma 3), we have $S \models C$. Then by the completeness of solve (Lemma 4) there exists S' and R such that $S' = \mathsf{solve}(C)$ and $R \circ S'^* \sqsubseteq S$. We then conclude using the definition of infer.

Theorem 6. The time complexity of the infer algorithm is $O(n\alpha(n))$ where n is the size of the program.

Proof. The constraint generation step is O(n) and the solver is $O(n\alpha(n))$ (the number of edges in the type graph is bounded by 2n because no type has out-degree greater than 2) so the overall time complexity is $O(n\alpha(n))$.

6 Related Work

The interface between dynamic and static typing has been a fertile area of research. We cite a limited number of papers for lack of space. The reader may refer to the references in the cited papers for more detailed lists for each topic.

Optional Types in Dynamic Languages Many dynamic languages allow explicit type annotations. Common LISP [14] is an example. In Common LISP, adding type annotations improves performance but the language does not make the guarantee that annotating all parameters in the program prevents all cast errors at run-time, as is the case for gradual typing. More recently, Tobin-Hochstadt and Felleisen [33, 34] developed a type system for Scheme that facilitates migration between dynamic and static code on a per-module basis.

Type Inference There is a huge body of literature on the topic of type inference, especially regarding variations of the Hindley-Milner type system [17]. Of that, the closest to our work is that on combining inference and subtyping [4, 26]. The main difference between inference for subtyping versus gradual typing is that subtyping has co/contra-variance in function types, whereas the consistency relation is covariant in both the parameter and return type, making the inference problem for gradual typing more tractable.

Gradual Typing In addition to the related work discussed in the introduction, we mention a couple more related works here. Anderson and Drossopoulou developed a gradual type system for BabyJ [2] that uses nominal types. Gronski, Knowles, Tomb, Freund, and Flanagan [9] provide gradual typing in the Sage language by including a Dynamic type and implicit downcasts. They use a modified form of subtyping to provide the implicit down-casts.

Quasi-static Typing Thatte's Quasi-Static Typing [32] is close to gradual typing but relies on subtyping and treats the unknown type as the top of the subtype hierarchy. Siek and Taha [29] show that implicit down-casts combined with the transitivity of subtyping creates a fundamental problem that prevents this type system from catching all type errors even when all parameters in the program are annotated.

Soft Typing Static analyses based on dataflow can be used to perform static checking and to optimize performance. The later variant of Soft Typing by Flanagan and Felleisen [7] is an example of this approach. These analyses provide warnings to the programmer while still allowing the programmer to execute their program immediately (even programs with errors), thereby preserving the benefits of dynamic typing. However, the programmer does not control which portions of a program are statically checked: these whole-program analyses have non-local interactions.

Dynamic Typing in Statically Typed Languages Abadi et al. [1] extended a statically typed language with a Dynamic type and explicit injection (dynamic) and projection operations (typecase). Their approach does not satisfy the goals of gradual typing, as migrating code between dynamic and static checking not only requires changing type annotations on parameters, but also adding or removing injection and projection operations throughout the code. Gradual typing automates the latter.

Hybrid Typing The Hybrid Type Checking of Flanagan [5] combines standard static typing with refinement types, where the refinements may express arbitrary predicates. This is

analogous to gradual typing in that it combines a weaker and stronger type system, allowing implicit coercions between the two systems and inserting run-time checks. A notable difference is that hybrid typing is based on subtyping whereas gradual typing is based on type consistency.

7 Conclusion

This paper develops a type system for the gradually typed lambda calculus with type variables $(\lambda_{\rightarrow}^{?\alpha})$. The system integrates type inference and gradual typing to aid programmers in adding types to their programs. In the proposed system, a programmer uses a type variable annotation to request the best solution for the variable from the inference algorithm.

The type system presented satisfies the defining properties of a gradual type system. That is, a programmer may omit type annotations on function parameters and immediately run the program; run-time type checks are performed to preserve type safety. Furthermore, a programmer may add type annotations to increase static checking. When all function parameters are annotated, all type errors are caught at compile-time.

The paper also develops an efficient inference algorithm for $\lambda_{\rightarrow}^{?\alpha}$ that is sound and complete with respect to the type system and that takes care not to infer types that would introduce cast errors.

A Isabelle Formalization

A.1 Syntax and Auxilliary Functions

```
types name = nat
datatype ty =
    UVarT\ name
   Int T
                (int)
   BoolT
                 (bool)
   DynT
                 (?)
  \mid ArrowT \ ty \ ty \ (\mathbf{infixr} \rightarrow 95)
datatype const = IntC int
               BoolC\ bool
               Succ
               IsZero
datatype expr =
    Var\ name
   Const const
   Lam name ty expr (\lambda-:-. - [53,53,53] 52)
  | App expr expr
types env = (name \times ty) \ list
types subst = (name \times ty) \ list
\mathbf{axclass} type\text{-}struct < type
instance ty::type-struct ..
instance expr::type-struct ..
instance nat::type-struct ...
instance option::(type-struct)type-struct ...
```

```
instance fun::(type, type-struct)type-struct..
instance \ list::(type-struct)type-struct ...
instance \ set::(type-struct)type-struct ..
instance *::(type-struct,type-struct)type-struct ..
          Auxilliary Functions
A.1.1
constdefs id-subst :: subst
 id-subst-def[simp]: id-subst \equiv []
— domain of an association list
consts
 Dom :: ('a \times 'b) \ list \Rightarrow 'a \ set
primrec
  Dom [] = \{\}
 Dom (xt \# ls) = insert (fst xt) (Dom ls)
consts
 lookup :: ('a \times 'b) \ list \Rightarrow 'a \Rightarrow 'b \ option
primrec
 lookup [] k = None
 lookup (kv \# ls) k =
    (if fst kv = k then Some (snd kv) else lookup ls k)
constdefs
 lookup-subst :: (name \times ty) list \Rightarrow name \Rightarrow ty (\%)
 lookup\text{-}subst\ S\ a\ \equiv
    (case\ (lookup\ S\ a)\ of\ None \Rightarrow UVarT\ a\mid Some\ t\Rightarrow t)
consts
  app\text{-}subst :: [subst, 'a::type\text{-}struct] => 'a::type\text{-}struct (\$)
syntax (latex)
  app\text{-}subst :: [subst, 'a::type\text{-}struct] => 'a::type\text{-}struct ()
primrec (app-subst-ty)
 S(UVarT a) = S(a)
 S (IntT) = (IntT)
 SS(BoolT) = (BoolT)
 subst-fun: S(t1 \rightarrow t2) = (S(t1) \rightarrow (S(t2)))
 S(?) = (?)
primrec (app-subst-list)
 S[] = []
 SS(x\#xs) = (SX)\#(SX)
defs (overloaded)
  app-subst-pair: Sp \equiv (fst \ p, Sp \ (snd \ p))
primrec (app-subst-expr)
subst-var: $S (Var x) = (Var x)
           SC(Const c) = (Const c)
subst-abs: S(\lambda x:\tau, e) = (\lambda x:S(\tau, e))
            S(App\ e1\ e2) = (App\ (Se1)\ (Se2))
```

primrec (app-subst-option) $app\text{-}subst\ S\ None = None$

```
app\text{-}subst\ S\ (Some\ \tau) = Some\ (app\text{-}subst\ S\ \tau)
defs (overloaded)
  app-subst-fun: app-subst S \Gamma \equiv (\lambda x. app-subst S (\Gamma x))
consts FTV :: 'a::type-struct \Rightarrow nat set
primrec (FTV-ty)
 FTV (UVarT \alpha) = \{\alpha\}
 FTV (IntT) = \{\}
 FTV (BoolT) = \{\}
 FTV (DynT) = \{\}
 FTV (t1 \rightarrow t2) = FTV t1 \cup FTV t2
primrec (FTV-expr)
 FTV (Var x) = \{\}
 FTV (Const c) = \{\}
 FTV (\lambda x:\tau. e) = FTV \tau \cup FTV e
 FTV (App \ e1 \ e2) = FTV \ e1 \cup FTV \ e2
primrec (FTV-option)
  FTV\ None = \{\}
 FTV (Some \ \tau) = FTV \ \tau
primrec (FTV-list)
 FTV [] = \{\}
 FTV\ (a\#ls) = FTV\ a \cup FTV\ ls
defs (overloaded)
 FTV-nat[simp]: FTV x \equiv \{x\}
defs (overloaded)
 FTV-pair[simp]: FTV p \equiv FTV (snd p)
defs (overloaded)
  FTV-set: FTV C \equiv \{\alpha : \exists e. \alpha \in FTV e \land e \in C \}
defs (overloaded)
 FTV-fun: FTV \Gamma \equiv \{\alpha. \exists y t. \Gamma y = t \land \alpha \in FTV t\}
consts no-dyn :: 'a::type-struct \Rightarrow bool
\mathbf{primrec} (no-dyn-ty)
  no-dyn (UVarT \alpha) = True
 no-dyn (Int T) = True
 no-dyn (BoolT) = True
 no-dyn (DynT) = False
 no-dyn (t1 \rightarrow t2) = (if (no-dyn t1) then (no-dyn t2) else False)
primrec (no-dyn-expr)
  no-dyn (Var x) = True
 no-dyn (Const c) = True
 no-dyn (\lambda x:\tau. e) = (if no-dyn \tau then no-dyn e else False)
 no-dyn (App\ e1\ e2) = (if\ no-dyn\ e1\ then\ no-dyn\ e2\ else\ False)
```

```
defs (overloaded)
  no-dyn-fun: no-dyn \Gamma \equiv (\forall x a. \Gamma x = a \longrightarrow no-dyn a)
primrec (no-dyn-option)
  no-dyn None = True
 no-dyn (Some <math>\tau) = no-dyn \tau
defs (overloaded)
  no\text{-}dyn\text{-}pair[simp]: no\text{-}dyn \ p \equiv no\text{-}dyn \ (snd \ p)
primrec (no-dyn-list)
 no-dyn [] = True
 no-dyn (a\#ls) = (if no-dyn a then no-dyn ls else False)
constdefs idempotent :: subst \Rightarrow bool
  idempotent S \equiv \$S \ (\% \ S) = \% \ S
        Properties of Auxilliary Functions
lemma finite-ftv-ty[intro!]: finite (FTV (\tau::ty))
 apply (induct \tau) by auto
lemma finite-ftv-expr[intro!]: finite (FTV (e::expr))
 apply (induct \ e) by auto
lemma finite-ftv-subst[intro!]: finite (FTV (S::subst))
 apply (induct S) by auto
lemma id-id[simp]: $id-subst(\tau::ty) = \tau apply (induct \tau)
 using lookup-subst-def by auto
lemma closed-subst-id: FTV \tau = \{\} \Longrightarrow \$S \ \tau = (\tau :: ty)
 apply (induct \tau) by auto
lemma idempotent-ty[rule-format]:
 \forall S. idempotent S \longrightarrow \$ S (\$ S t) = \$ S (t::ty)
 apply (induct t) defer apply simp apply simp apply simp apply simp
proof -
 \mathbf{fix} \ n :: nat
 show \forall S. idempotent S \longrightarrow S (S (UVarT n)) = S (UVarT n)
 proof clarify
   fix S assume id: idempotent S
   have S(S(UVarT(n))) = S(S(NS(n)) by S(NS(n))
   also have ... = (\$S (\%S)) n by (simp \ add: app-subst-fun)
   also from id have ... = \%S n by (simp add: idempotent-def)
   also have ... = S(UVarT n) by simp
   finally show S(S(UVarT n)) = S(UVarT n) by blast
 qed
qed
lemma ftv-dom-id[rule-format]:
 \forall S. (\forall a. a \in FTV \ \tau \longrightarrow \% \ S \ a = UVarT \ a) = (\$S \ \tau = (\tau ::ty))
 apply (induct \tau) by auto
— This is Lemma 2 of the paper
lemma t1tot2eqSt-implies-t2eqSt2[rule-format]:
```

```
idempotent S \wedge (\$S \ \tau = \tau_1 \rightarrow \tau_2) \longrightarrow \tau_2 = \$S \ \tau_2
  apply (induct-tac \tau) defer apply force apply force apply force
  apply simp apply (rule impI) defer apply (rule impI)
proof -
  \mathbf{fix} \ a
  assume tmp: idempotent S \wedge \$S (UVarT a) = \tau_1 \rightarrow \tau_2
  from tmp have idems: idempotent S by simp
  from idems have sstt: S(S(UVarT a)) = (S(UVarT a))
    by (rule idempotent-ty)
  with tmp sstt have snegst1tost2: ($S (UVarT a)) = $S \tau_1 \rightarrow $S \tau_2$ by simp
  with tmp show \tau_2 = \$S \ \tau_2 by simp
next
  fix ty1 ty2
  assume styc: idempotent S \wedge \$S \ ty1 = \tau_1 \wedge \$S \ ty2 = \tau_2
  hence idempotent S by simp
  hence \$S (\$S ty2) = \$S ty2 by (rule idempotent-ty)
  with styc show \tau_2 = \$S \ \tau_2 by simp
lemma Steqt1tot2-implies-t2eqSt2[rule-format]:
  idempotent S \wedge (\tau_1 \rightarrow \tau_2 = \$S \ \tau) \longrightarrow \tau_2 = \$S \ \tau_2
  have idempotent S \wedge \$S \ \tau = \tau_1 \rightarrow \tau_2 \longrightarrow \tau_2 = \$S \ \tau_2
    using t1tot2eqSt-implies-t2eqSt2 by blast
  thus idempotent S \wedge (\tau_1 \rightarrow \tau_2 = \$S \ \tau) \longrightarrow \tau_2 = \$S \ \tau_2 by auto
qed
lemma Steqt1tot2-implies-st2eqt2:
  \llbracket idempotent \ S; \ \tau_1 \rightarrow \tau_2 = \$S \ \tau \ \rrbracket \Longrightarrow \$S \ \tau_2 = \tau_2
  using Steqt1tot2-implies-t2eqSt2 by auto
A.2
           The Simply Typed Lambda Calculus
consts TypeOf :: const \Rightarrow ty
primrec
  TypeOf\ (IntC\ n) = IntT
  TypeOf\ (BoolC\ b) = BoolT
  TypeOf\ Succ = IntT \rightarrow IntT
  TypeOf\ IsZero = IntT \rightarrow BoolT
inductive stlc\text{-}wt :: env \Rightarrow expr \Rightarrow ty \Rightarrow bool (- \vdash - : - [52,52,52] 51)
where
  Var[intro!]: \llbracket lookup \ \Gamma \ x = Some \ \tau \ \rrbracket \Longrightarrow \Gamma \vdash Var \ x : \tau \ |
  Const[intro!]: \Gamma \vdash Const \ c : TypeOf \ c \mid
  Abs[intro!]: [\![(x,\tau_1)\#\Gamma \vdash e:\tau_2]\!] \Longrightarrow \Gamma \vdash (\lambda x:\tau_1. \ e):\tau_1 \to \tau_2 \mid
  App[intro!]: \llbracket \Gamma \vdash e : \tau_1 \rightarrow \tau_2; \Gamma \vdash e' : \tau_1 \rrbracket
              \Longrightarrow \Gamma \vdash (App \ e \ e') : \tau_2
inductive istlc\text{-}wt :: [subst,env] \Rightarrow [expr,ty] \Rightarrow bool (-;-\vdash -:-[52,52,52,52] 51)
where
  SVar[intro!]: \llbracket lookup \ \Gamma \ x = Some \ \tau \ \rrbracket \Longrightarrow S; \Gamma \vdash Var \ x : \tau \ \rfloor
  SConst[intro!]: \tau = TypeOf \ c \Longrightarrow S;\Gamma \vdash Const \ c : \tau \mid
  SAbs[intro!]: [S;(x,\tau_1)\#\Gamma \vdash e:\tau_2] \implies S;\Gamma \vdash (\lambda x:\tau_1. e):\tau_1 \rightarrow \tau_2
```

```
SApp[intro!]: [S;\Gamma \vdash e : \tau_1; S;\Gamma \vdash e' : \tau_2; ST \vdash e' : \tau_2; T \vdash e' : \tau_3)]
            \implies S; \Gamma \vdash (App \ e \ e') : \tau_3
lemma ex-t[rule-format]: \forall S x. lookup (\$(S::subst) \Gamma'::env) x = Some \tau \longrightarrow
  (\exists \ \tau'. \ lookup \ \Gamma' \ x = Some \ \tau' \land \$S \ \tau' = \tau)
 apply (induct \Gamma')
 apply simp
 apply clarify apply (simp add: app-subst-pair)
   apply (case-tac a = x) apply simp
   apply auto
   done
lemma idem-ftvst-impl:
 \forall S \ a. \ idempotent \ S \land a \in FTV \ (\$S \ (\tau::ty)) \longrightarrow \%S \ a = UVarT \ a
 apply (induct \tau)
 defer apply simp apply simp apply simp apply simp apply blast
 apply clarify
proof -
 \mathbf{fix} \ b \ S \ a
 assume ids: idempotent S and aftv: a \in FTV ($ S(UVarT b))
 from ids have S(S(UVarT b)) = S(UVarT b) by (rule idempotent-ty)
 hence \forall a. a \in FTV \ (\$ S \ (UVarT \ b)) \longrightarrow \%S \ a = UVarT \ a \ using \ ftv-dom-id \ by \ blast
 with aftv show \% S a = UVarT a by simp
qed
lemma idem-ftvst:
  \llbracket \ idempotent \ S; \ a \in FTV \ (\$S \ (\tau :: ty)) \ \rrbracket \Longrightarrow \%S \ a = \ UVarT \ a
 using idem-ftvst-impl by blast
lemma ftv-wt-sub-impl: \Gamma' \vdash e' : \tau \Longrightarrow
  \forall \Gamma e S. idempotent S \wedge \Gamma' = \$S \Gamma \wedge e' = \$S e
   \longrightarrow (\forall a. a \in FTV \ \tau \longrightarrow \% \ S \ a = UVarT \ a)
 apply (induct rule: stlc-wt.induct)
 defer
 apply (case-tac c) apply force apply force apply force apply force
 apply clarify apply (case-tac ea) apply force apply force prefer 2 apply force
   apply simp apply (erule-tac x=(x,\tau_1)\#\Gamma' in all E)
     apply (erule-tac x=expr in allE)
     apply (erule-tac x=S in all E) apply (erule impE) apply simp
     apply (simp add: app-subst-pair) apply (simp add: idempotent-ty)
     apply clarify apply (erule disjE) apply simp
       using idem-ftvst apply simp apply simp
 apply clarify apply (case-tac ea) apply force apply force apply force
   apply (erule-tac x=\Gamma' in allE) apply (erule-tac x=\Gamma in allE)
   apply (erule-tac x=expr1 in all E) apply (erule-tac x=expr2 in all E)
   apply (erule-tac x=S in all E) apply (erule-tac x=S in all E)
   apply (erule impE) apply (simp add: app-subst-fun)
   apply simp
 apply clarify
proof -
 fix \Gamma x and \tau::ty and \Gamma' e and S::subst and a
 assume sgx: lookup ($ S \Gamma') x = Some \tau and ids: idempotent S
   and xse: Var x = $ S e and aft: a \in FTV \tau
 from sgx have X: \exists \tau'. lookup \Gamma' x = Some \tau' \land \$S \tau' = \tau by (rule \ ex-t)
 from X obtain \tau' where gpx: lookup \Gamma' x = Some \ \tau' and stp: ST = \tau' by blast
```

```
from aft stp have afst: a \in FTV ($S \tau') by simp
  from ids afst show % S a = UVarT a by (rule idem-ftvst)
qed
lemma ftv-wt-sub: \llbracket \$S \ \Gamma \vdash \$S \ e : \tau; idempotent \ S \ \rrbracket
  \implies (\forall a. a \in FTV \ \tau \longrightarrow \%S \ a = UVarT \ a)
 using ftv-wt-sub-impl apply blast done
— Lemma 1 of the paper
lemma ewt-steqt:
 assumes idems: idempotent S and ewt: S \Gamma \vdash S e : \tau
 shows S \tau = \tau
 using idems ewt ftv-wt-sub ftv-dom-id by blast
lemma ewt-ewSt:
 assumes idems: idempotent S and ewt: S \Gamma \vdash S e : \tau
 shows S \Gamma \vdash S e : S \tau
proof -
   from ewt idems have (\forall a. a \in FTV \ \tau \longrightarrow \%S \ a = UVarT \ a) by (rule \ ftv-wt-sub)
   hence ST = \tau using ftv-dom-id by blast
   thus S \Gamma \vdash S e : S \tau \text{ by } simp
qed
lemma ewt-teqSt:
 assumes idems: idempotent S and ewt: S \Gamma \vdash S e : \tau
 shows \tau = \$S \ \tau
proof -
 from idems ewt have S \tau = \tau by (rule ewt-steqt)
 thus \tau = \$S \ \tau \ \text{by} \ auto
qed
\mathbf{lemma}\ stlc	ext{-}implies	ext{-}istlc	ext{-}impl:
 \Gamma' \vdash e' : \tau' \Longrightarrow
   (\forall \Gamma \ e \ S \ \tau \ . \ idempotent \ S \land \Gamma' = \$S \ \Gamma \land e' = \$S \ e \land \tau' = (\$S \ \tau)
  \longrightarrow (\exists \tau'' . (S; \Gamma \vdash e : \tau'' \land \$S \tau'' = \tau')))
 apply (induct rule: stlc-wt.induct)
 apply clarify defer apply clarify defer apply clarify defer
proof -
 fix \Gamma x \tau and \Gamma'::env and e::expr and S::subst and \tau'
 assume sgx: lookup ($ S \Gamma') x = Some ($ S \tau') and ids: idempotent S
   and vxe: Var x = $ S e
  from sgx\ ex-t obtain \tau'' where lgx: lookup\ \Gamma'\ x = Some\ \tau''
   and stst: S \tau'' = S \tau' by blast
  from vxe lgx stst show \exists \tau''. S;\Gamma' \vdash e : \tau'' \land \$ S \tau'' = \$ S \tau'
   apply (case-tac e::expr) apply (rule-tac x=\tau'' in exI) by auto
next
 fix \Gamma c \Gamma' e S \tau
 assume idempotent S and Const c = S e and TypeOf c = S S \tau
  thus \exists \tau''. S : \Gamma' \vdash e : \tau'' \land \$ S \tau'' = TypeOf c
   apply (rule-tac x = TypeOf c in exI)
   apply (simp add: idempotent-ty)
   apply (case-tac e::expr) apply auto done
next
 fix x \tau_1 \Gamma e \tau_2 \Gamma' ea S \tau
 assume IH1: \forall \Gamma ea Sa \tau.
```

```
idempotent Sa \land
           (x, \tau_1) \# \$S \Gamma' = \$Sa \Gamma \wedge e = \$Sa ea \wedge \tau_2 = \$Sa \tau \longrightarrow
           (\exists \tau''. Sa; \Gamma \vdash ea : \tau'' \land \$ Sa \tau'' = \tau_2)
    and ids: idempotent S and le: \lambda x:\tau_1. e=\$ S ea and t12st: \tau_1\to\tau_2=\$ S \tau
  from le obtain t b where ea: ea = \lambda x:t. b and t1st: \tau_1 = \$S t
    and esb: e = \$S \ b apply (case-tac ea::expr) apply auto done
  from ids t12st have t2st2: \tau_2 = \$S \ \tau_2 using Steqt1tot2-implies-t2eqSt2 by blast
  from ids IH1 t1st ea esb
  have X: \exists \tau''. S; (x,t) \# \Gamma' \vdash b : \tau'' \land \$S \tau'' = \tau_2
    apply auto apply (erule-tac x=(x,t)\#\Gamma' in allE)
       apply (erule-tac x=b in allE)
       apply (erule-tac \ x=S \ in \ all E)
       apply (erule-tac x=\tau_2 in allE) apply auto
       apply (simp add: app-subst-pair) using t2st2 apply simp done
  from X obtain t2 where wtb: S:(x,t)\#\Gamma'\vdash b:t2 and st2t2:\$S\ t2=\tau_2 by blast
  from wtb have wtl: S;\Gamma' \vdash \lambda x:t.\ b:t \rightarrow t2 by blast
  with ea st2t2 t1st
  show \exists \tau''. S; \Gamma' \vdash ea : \tau'' \land \$ S \tau'' = \tau_1 \rightarrow \tau_2 by auto
next
  fix \Gamma e \tau_1 \tau_2 e' \Gamma' ea S \tau
  assume wte: $ S \ \Gamma' \vdash e : \tau_1 \rightarrow $ S \ \tau
    and IH1: \forall \Gamma ea Sa \tau'.
           idempotent \ Sa \ \land
           \$S\Gamma' = \$Sa\Gamma \land e = \$Saea \land \tau_1 \rightarrow \$S\tau = \$Sa\tau' \longrightarrow
           (\exists \tau''. Sa; \Gamma \vdash ea : \tau'' \land \$ Sa \tau'' = \tau_1 \rightarrow \$ S \tau)
    and wtep: S \Gamma' \vdash e' : \tau_1
    and IH2: \forall \Gamma \ e \ Sa \ \tau.
           idempotent\ Sa \wedge \$\ S\ \Gamma' = \$\ Sa\ \Gamma \wedge e' = \$\ Sa\ e \wedge \tau_1 = \$\ Sa\ \tau \longrightarrow
           (\exists \tau''. Sa; \Gamma \vdash e : \tau'' \land \$ Sa \tau'' = \tau_1)
    and ids: idempotent S and A: App e e' = S ea
  from A obtain e1 e2 where EA: ea = App \ e1 \ e2 and E: e = SE \ e1
    and EP: e' = \$S \ e2 apply (case-tac ea::expr) by auto
  from ids wte E have \tau_1 \to \$ S \tau = \$S (\tau_1 \to \$ S \tau) using ewt-tegSt by blast
  hence t1st1: \tau_1 = \$S \ \tau_1 \ \text{by} \ simp
  from ids E IH1 t1st1 obtain t1 where wte1: S;\Gamma' \vdash e1 : t1
    and st1t1st: \$S\ t1 = \tau_1 \rightarrow \$\ S\ \tau
    apply auto apply (erule-tac x=\Gamma' in allE)
    apply (erule-tac x=e1 in allE)
    apply (erule-tac x=S in allE)
    apply (erule-tac x=\tau_1 \rightarrow \$ S \tau \text{ in } allE)
    apply auto using idempotent-ty apply simp done
  from ids EP IH2 obtain t2 where wte2: S:\Gamma' \vdash e2 : t2 and st2t1: \$ S t2 = \tau_1
    apply simp apply (erule\text{-}tac \ x=\Gamma' \ \mathbf{in} \ all E)
    apply (erule-tac \ x=e2 \ in \ all E)
    apply (erule-tac x=S in allE)
    apply (erule-tac x=\tau_1 in allE)
    apply auto using t1st1 apply simp done
  from st1t1st\ st2t1 have eq: \$S\ t1 = \$S\ (t2 \to \tau) by simp
  from wte1 wte2 eq EA
  show \exists \tau''. S; \Gamma' \vdash ea : \tau'' \land \$ S \tau'' = \$ S \tau by auto
qed
lemma stlc-implies-istlc-impl2:
  \llbracket idempotent \ S; \$S \ \Gamma \vdash \$S \ e : \$S \ \tau \ \rrbracket \Longrightarrow (\exists \ \tau'. \ S; \Gamma \vdash e : \tau' \land \$S \ \tau' = \$S \ \tau)
  using stlc-implies-istlc-impl by blast
```

```
lemma stlc-implies-istlc:
 assumes wte: S \Gamma \vdash S e : \tau and ids: idempotent S
 shows \exists \tau'. S; \Gamma \vdash e : \tau' \land \$S \tau' = \tau
proof -
  from ids wte have wte2: S \Gamma \vdash S e : S \tau by (rule ewt-ewSt)
  from ids wte2 obtain \tau' where wtep: S;\Gamma \vdash e : \tau' and stst: S \tau' = S \tau
    using stlc-implies-istlc-impl2 by blast
  from ids wte have S \tau = \tau by (rule ewt-steqt)
 with wtep stst show ?thesis by auto
qed
lemma stlc-wt-implies-teqSt:
   assumes idems: idempotent S and ewt: S \Gamma \vdash S e : \tau
  shows \tau = \$S \ \tau
proof -
 from ewt idems have \forall a. a \in FTV \ \tau \longrightarrow \%S \ a = UVarT \ a by (rule ftv-wt-sub)
 hence S \tau = \tau using ftv-dom-id by blast
 thus \tau = \$S \ \tau \ \text{by} \ auto
qed
lemma subst-const[simp]: S (TypeOf c) = TypeOf c
 apply (case-tac \ c) apply auto \ done
lemma \ subst-env[rule-format]:
  \forall x \tau S. lookup \Gamma x = Some \tau \longrightarrow lookup (\$ S \Gamma) x = Some (\$ S \tau)
 apply (induct \ \Gamma) apply simp
 apply clarify apply (simp add: app-subst-pair)
    apply (case-tac a = x) apply simp
    apply auto
    done
lemma istlc-implies-stlc:
  S;\Gamma \vdash e : \tau \Longrightarrow \$S \ \Gamma \vdash \$S \ e : \$S \ \tau
  apply (induct rule: istlc-wt.induct)
 \mathbf{apply} \ simp \ \mathbf{apply} \ (\mathit{rule} \ \mathit{Var}) \ \mathbf{apply} \ (\mathit{simp} \ \mathit{add} \colon \mathit{subst-env})
 apply simp apply blast
 defer
 apply simp apply (rule App) apply simp apply simp
proof -
  fix S::subst and \Gamma::env and \tau_1 \tau_2 e x
  assume S:(x,\tau_1)\#\Gamma \vdash e:\tau_2 and SE: \$ S ((x,\tau_1)\#\Gamma) \vdash \$ S e:\$ S \tau_2
 have S((x,\tau_1)\#\Gamma) = (x, S_{\tau_1})\#(S_{\tau_1})\#(S_{\tau_1}) by (simp\ add:\ app-subst-pair)
  with SE have (x,\$S \ \tau_1)\#(\$ \ S \ \Gamma) \vdash \$ \ S \ e : \$ \ S \ \tau_2 by simp
  thus S \Gamma \vdash S (\lambda x : \tau_1. \ e) : S (\tau_1 \rightarrow \tau_2) by auto
qed
— Theorem 1 of the paper
theorem sltc-istlc-equivalent:
  (idempotent \ S \land \$S \ \Gamma \vdash \$S \ e : \tau \longrightarrow (\exists \ \tau'. \ S; \Gamma \vdash e : \tau' \land \$S \ \tau' = \tau))
  \wedge (S; \Gamma \vdash e : \tau \longrightarrow \$S \ \Gamma \vdash \$S \ e : \$S \ \tau)
  apply (rule\ conjI)
  using stlc-implies-istlc apply simp
  using istlc-implies-stlc apply simp
  done
```

A.3 Choosing Fresh Variables

In various places within the formal development we need to choose a "fresh" variable. More specifically, we need to choose a variable that is not in some set, such as the domain of the type environment. Variables are represented here as natural numbers, and we constructively choose a fresh variable by taking the successor of the maximum number in the set. Of course, we must assume that the set in question is finite.

```
constdefs max :: nat \Rightarrow nat \Rightarrow nat

max \ x \ y \equiv (if \ x < y \ then \ y \ else \ x)

declare max-def[simp]
```

To define the maximum number in a set, we take advantage of Isabelle's ability to fold over a finite set. To use fold with the above max function, we must first prove a few properties of max, but the proofs go through automatically.

```
interpretation AC-max: ACe [max 0::nat]
by unfold-locales (auto intro: add-assoc add-commute)
constdefs setmax :: nat set \Rightarrow nat
setmax S \equiv fold \ max \ (\lambda \ x. \ x) \ 0 \ S
```

We want to show that the successor of the maximum element of a set is not in the set. Towards proving that we prove the following lemma.

```
lemma max-qe: finite L \Longrightarrow \forall x \in L. x < set max L
 apply (induct rule: finite-induct)
 \mathbf{apply} \ simp
 apply clarify
 apply (case-tac \ xa = x)
proof -
 fix x and F::nat set and xa
 assume fF: finite F and xF: x \notin F and xax: xa = x
 from fF \ xF have mc: setmax \ (insert \ x \ F) = max \ x \ (setmax \ F)
   apply (simp only: setmax-def)
   apply (rule AC-max.fold-insert)
   apply auto done
 with xax show xa \leq setmax (insert x F)
   apply clarify by simp
next
 fix x and F::nat set and xa
 assume fF: finite F and xF: x \notin F
   and axF: \forall x \in F. \ x \leq setmax \ F
   and xsxF: xa \in insert \ x \ F
   and xax: xa \neq x
 from xax xsxF have xaF: xa \in F by auto
 with axF have xasF: xa \leq setmax F by blast
 from fF xF have mc: setmax (insert x F) = max x (setmax F)
   apply (simp only: setmax-def)
   apply (rule AC-max.fold-insert)
   apply auto done
 with xasF show xa \leq setmax (insert x F) by auto
qed
```

lemma max-is-fresh[simp]:

```
assumes F: finite L shows Suc (setmax L) \notin L
proof
 assume ssl: Suc (setmax L) \in L
 with F max-ge have Suc (setmax L) \leq setmax L by blast
 thus False by simp
qed
lemma greaterthan-max-is-fresh[simp]:
 assumes F: finite L and I: setmax L < i
 shows i \notin L
proof
 assume ssl: i \in L
 with F max-ge have i \leq setmax L by blast
 with I show False by simp
\mathbf{qed}
lemma subset-implies-lessmax-impl:
 finite A \Longrightarrow \forall B. finite B \land A \subseteq B \longrightarrow setmax A \leq setmax B
 apply (induct rule: finite-induct)
 apply (simp add: setmax-def)
proof -
 fix x F assume fF: finite F and xF: x \notin F
   and IH: \forall B. \text{ finite } B \land F \subseteq B \longrightarrow setmax \ F \leq setmax \ B
 show \forall B. finite B \land insert \ x \ F \subseteq B \longrightarrow setmax \ (insert \ x \ F) \le setmax \ B
 proof clarify
   fix B assume fB: finite B and xFsubB: insert x F \subseteq B
   from fF \ xF have smxF: setmax \ (insert \ x \ F) = max \ x \ (setmax \ F)
     apply (simp only: setmax-def) apply (rule AC-max.fold-insert) by auto
   from xFsubB have xB: x \in B by auto
   from fB xB have xleB: x \leq setmax B using max-ge by blast
   from xFsubB have FsubB: F \subseteq B by auto
   from fB \ FsubB \ IH have setmax \ F \le setmax \ B by simp
   with xleB \ smxF \ show \ setmax \ (insert \ x \ F) \le setmax \ B \ by \ simp
 qed
\mathbf{qed}
lemma subset-implies-lessmax:
  \llbracket \text{ finite } B; A \subseteq B \rrbracket \Longrightarrow \operatorname{setmax} A \leq \operatorname{setmax} B
 apply (frule finite-subset) apply simp
 using subset-implies-lessmax-impl apply simp
 done
```

A.4 The Consistency and Less Informative Relations

```
inductive consistent :: ty \Rightarrow ty \Rightarrow bool (infix \sim 51) where  \begin{array}{c} \textit{CRefl[intro!]: } \tau \sim \tau \mid \\ \textit{CFun[intro!]: } \llbracket \ \sigma \sim \tau; \ \sigma' \sim \tau' \ \rrbracket \Longrightarrow (\sigma \to \sigma') \sim (\tau \to \tau') \mid \\ \textit{CUnR[intro!]: } \tau \sim ? \mid \\ \textit{CUnL[intro!]: } ? \sim \tau \\ \\ \textbf{lemma consistent-reflexive: } \sigma \sim \sigma \\ \textbf{apply (induct rule: } ty.induct) \ \textbf{apply } auto \ \textbf{done} \\ \end{array}
```

```
lemma consistent-symmetric: \sigma \sim \tau \Longrightarrow \tau \sim \sigma
  apply (induct rule: consistent.induct) by auto
{f lemma} consistent-not-trans:
  \neg (\forall \tau_1 \tau_2 \tau_3. \tau_1 \sim \tau_2 \wedge \tau_2 \sim \tau_3 \longrightarrow \tau_1 \sim \tau_3)
proof -
  have A: IntT \sim ? by auto
  have B: ? \sim BoolT by auto
  have C: \neg (IntT \sim BoolT) by auto
  from A B C show ?thesis by auto
qed
inductive less-info :: ty \Rightarrow ty \Rightarrow bool (infixl \sqsubseteq 51)
  LEInt[intro!]: IntT \sqsubseteq IntT \mid
  LEBool[intro!]: BoolT \sqsubseteq BoolT
  LEUVar[intro!]: UVarT \ \alpha \sqsubseteq UVarT \ \alpha \mid
  \textit{LEFun[intro!]:} ~ \llbracket ~\sigma \sqsubseteq \tau; ~\sigma' \sqsubseteq \tau' ~ \rrbracket \Longrightarrow (\sigma \to \sigma') \sqsubseteq ~ (\tau \to \tau') ~ |
  LEBottom[intro!]: ? \sqsubseteq \tau
lemma less-info-refl[intro!]: t \sqsubseteq t
  apply (induct\ t) by auto
\mathbf{lemma}\ \mathit{less-info-transitive-impl}:
  \forall \ \rho \ \tau. \ \rho \sqsubseteq \sigma \land \sigma \sqsubseteq \tau \longrightarrow \rho \sqsubseteq \tau
  apply (induct \sigma) apply blast+ done
lemma less-info-transitive: \llbracket \varrho \sqsubseteq \sigma; \sigma \sqsubseteq \tau \rrbracket \implies \varrho \sqsubseteq \tau
  using less-info-transitive-impl by blast
lemma less-info-implies-consistent: \sigma \sqsubseteq \tau \Longrightarrow \sigma \sim \tau
  apply (induct rule: less-info.induct) by auto
lemma less-cons-implies-cons[rule-format]: \sigma \sqsubseteq \tau \Longrightarrow (\forall \ \tau'. \ \tau \sim \tau' \longrightarrow \sigma \sim \tau')
  apply (induct rule: less-info.induct)
  apply simp
  apply simp
  apply simp
  apply clarify
    apply (erule cons-fun-any)
    apply simp
    apply (erule-tac x=\tau in allE)
    apply (erule-tac x=\tau' in allE)
    apply force
    apply simp apply blast
  apply simp
    apply (erule-tac x=\tau'' in allE)
    apply (erule-tac x=\tau'b in allE)
    apply force
  apply force
  done
lemma cons-less-less: t1 \sim t2 \Longrightarrow (\exists t3. t1 \sqsubseteq t3 \land t2 \sqsubseteq t3)
  apply (induct rule: consistent.induct) apply blast+ done
```

```
lemma less-less-cons[rule-format]: t1 \sqsubseteq t2 \Longrightarrow (\forall \ t3.\ t3 \sqsubseteq t2 \longrightarrow t1 \sim t3) apply (induct rule: less-info.induct) apply clarify apply (rule consistent-symmetric) apply (rule less-info-implies-consistent) apply assumption apply blast apply blast apply blast apply blast done
```

A.5 The Gradual Type System

```
inductive gtlc\text{-}wt :: env \Rightarrow [expr,ty] \Rightarrow bool \ (\neg \vdash_g \neg : \neg [52,52,52] 51)
where

WTVar[intro!]: \llbracket \ lookup \ \Gamma \ x = Some \ \tau \ \rrbracket \implies \Gamma \vdash_g Var \ x : \tau \mid

WTConst[intro!]: \Gamma \vdash_g Const \ c : TypeOf \ c \mid

WTAbs[intro!]: \llbracket \ (x,\tau)\#\Gamma \vdash_g e : \varrho \ \rrbracket \implies \Gamma \vdash_g (\lambda x : \tau . \ e) : \tau \rightarrow \varrho \mid

WTApp1[intro!]: \llbracket \ \Gamma \vdash_g e : ?; \Gamma \vdash_g e' : \tau \ \rrbracket \implies \Gamma \vdash_g (App \ e \ e') : ? \mid

WTApp2[intro!]: \llbracket \ \Gamma \vdash_g e : \tau \rightarrow \varrho; \Gamma \vdash_g e' : \tau'; \tau' \sim \tau \ \rrbracket

\Longrightarrow \Gamma \vdash_g (App \ e \ e') : \varrho
```

A.6 Consistent-equal and Consistent-less

```
inductive consistent-equal :: subst \Rightarrow [ty, ty] \Rightarrow bool (- \vdash - \simeq - [50,50,50] 51) and consistent-less :: subst \Rightarrow [ty, ty] \Rightarrow bool (- \vdash - \sqsubseteq - [50,50,50] 51) where CEInt[intro!]: S \vdash IntT \simeq IntT \mid CEBool[intro!]: S \vdash BoolT \simeq BoolT \mid CEDynL[intro!]: S \vdash ? \simeq \tau \mid CEDynR[intro!]: S \vdash \tau \simeq ? \mid CEFun[intro!]: S \vdash \tau \simeq ? \mid CEFun[intro!]: S \vdash \tau \subseteq \%S \ \alpha \Longrightarrow S \vdash \tau \simeq UVarT \ \alpha \mid CEVarL[intro!]: S \vdash \tau \sqsubseteq \%S \ \alpha \Longrightarrow S \vdash UVarT \ \alpha \simeq \tau \mid CLVar[intro!]: S \vdash T \sqsubseteq T SoolT T \vdash T CLBool[intro!]: S \vdash T \vdash T SoolT T \vdash T CLBool[intro!]: S \vdash T \vdash T SoolT T \vdash T CLFun[intro!]: T \vdash T SoolT T \vdash T SoolT T SoolT T CLFun[intro!]: T SoolT T SoolT T SoolT T CLFun[intro!]: T SoolT T
```

A.6.1 Properties of Consistent-equal/less

The following lemmas correspond to Proposition 1 of the paper.

```
lemma consless-refl: S \vdash t \sqsubseteq \$S \ t \ \text{apply} \ (induct \ t) \ \text{by} \ auto
```

```
lemma consless-trans-impl: (S \vdash \tau 1 \simeq \tau 2 \longrightarrow True)
 \land (S \vdash \tau 2 \sqsubseteq \tau 3 \longrightarrow (\forall \ \tau 1.\ \tau 1 \sqsubseteq \tau 2 \longrightarrow S \vdash \tau 1 \sqsubseteq \tau 3))
 apply (induct rule: consistent-equal-consistent-less.induct) by auto
 lemma consless-trans: \llbracket \tau 1 \sqsubseteq \tau 2; S \vdash \tau 2 \sqsubseteq \tau 3 \rrbracket \Longrightarrow S \vdash \tau 1 \sqsubseteq \tau 3
 using consless-trans-impl by blast
```

```
lemma conseq-refl: S \vdash \tau \simeq \tau
  apply (induct \tau) apply blast+ done
lemma conseq-symm-impl: (S \vdash \tau \simeq \tau' \longrightarrow S \vdash \tau' \simeq \tau) \land (S \vdash \tau \sqsubseteq \tau' \longrightarrow True)
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply auto
  done
lemma conseq-symm: S \vdash \tau \simeq \tau' \Longrightarrow S \vdash \tau' \simeq \tau
  using conseq-symm-impl by blast
lemma conseq-less-no-dyn-equal-impl:
  (S \vdash \tau 1 \simeq \tau 2 \longrightarrow no\text{-}dyn \ \tau 1 \land no\text{-}dyn \ \tau 2 \longrightarrow \$S \ \tau 1 = \$S \ \tau 2)
  \wedge (S \vdash \tau \sqsubseteq \tau' \longrightarrow no\text{-}dyn \ \tau \longrightarrow \$S \ \tau = \tau')
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply simp+
  done
lemma conseq-no-dyn-equal:
  \llbracket S \vdash \tau \simeq \tau'; \text{ no-dyn } \tau; \text{ no-dyn } \tau' \rrbracket \Longrightarrow \$S \ \tau = \$S \ \tau'
  using conseq-less-no-dyn-equal-impl by blast
lemma less-no-dyn-equal:
  \llbracket S \vdash \tau \sqsubseteq \tau'; \text{ no-dyn } \tau \rrbracket \Longrightarrow \$S \ \tau = \tau'
  using conseq-less-no-dyn-equal-impl by blast
lemma less-conseq-less-impl: (S \vdash \tau 1 \simeq \tau 2 \longrightarrow True)
  \land (S \vdash \tau \sqsubseteq \tau'' \longrightarrow no\text{-}dyn \ \tau \longrightarrow
  (\forall \tau'. \ no\text{-}dyn \ \tau' \land S \vdash \tau \simeq \tau' \longrightarrow S \vdash \tau' \sqsubseteq \tau''))
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply simp apply simp apply simp apply simp apply simp apply simp
  apply force apply force apply force apply force apply (rule impI) apply simp
  apply (case-tac no-dyn \sigma) apply simp
  prefer 2 apply simp
  apply clarify
  apply (erule conseq-fun-any)
    apply simp apply simp
    apply (case-tac no-dyn \tau'') apply simp
    prefer 2 apply simp
    apply (rule CLFun)
    apply force
    apply force
    apply simp
      apply (rule CLVar)
      apply (erule consless-fun-any)
      apply simp
      apply (rule\ conjI)
proof -
  fix S \sigma \sigma' \tau \tau' \tau' a \alpha \tau'' \tau' b
  assume st: S \vdash \sigma \sqsubseteq \tau and ns: no-dyn \sigma and stt: S \vdash \sigma \sqsubseteq \tau''
  from st ns have sst: S = \tau by (rule less-no-dyn-equal)
  from stt ns have S = \tau'' by (rule less-no-dyn-equal)
```

```
with sst show \tau'' = \tau by simp
next
  fix S \sigma \sigma' \tau \tau' \tau' a \alpha \tau'' \tau' b
  assume st: S \vdash \sigma' \sqsubseteq \tau' and ns: no-dyn \sigma' and stt: S \vdash \sigma' \sqsubseteq \tau'b
  from st ns have sst: S \sigma' = \tau' by (rule less-no-dyn-equal)
  from stt ns have $S \sigma' = \tau'b by (rule less-no-dyn-equal)
  with sst show \tau'b = \tau' by simp
qed
lemma less-conseq-less: [S \vdash \tau \sqsubseteq \tau''; no\text{-}dyn \ \tau; no\text{-}dyn \ \tau'; S \vdash \tau \simeq \tau']
  \Longrightarrow S \vdash \tau' \sqsubset \tau''
  using less-conseq-less-impl by blast
lemma less-less-conseq-impl:
  (S \vdash \tau \simeq \tau' \longrightarrow \mathit{True}) \land
  (S \vdash \tau \sqsubseteq \varrho \longrightarrow (\forall \ \tau'. \ S \vdash \tau' \sqsubseteq \varrho \longrightarrow S \vdash \tau \simeq \tau'))
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply simp+
  apply blast
  apply force
  apply force
  apply force
  apply clarify apply (rule consless-any-fun) apply auto
  done
lemma less-less-conseq:
  \llbracket S \vdash \tau \sqsubseteq \rho; S \vdash \tau' \sqsubseteq \rho \rrbracket \Longrightarrow S \vdash \tau \simeq \tau'
  using less-less-conseq-impl by blast
lemma subst-typeof: S(TypeOf c) = TypeOf c
  apply (case-tac c) apply auto done
lemma subst-const: S (Const c) = Const c
  apply (case-tac c) apply auto done
lemma subst-extend-env: S((x,\tau)\#\Gamma) = (x, S(\tau)\#(S(\tau))
  by (simp add: app-subst-pair)
lemma cons-any-fun2:
  \tau \sim t1 \, \rightarrow \, t2 \Longrightarrow (\tau = ?) \, \vee \, (\exists \ s1 \ s2. \ \tau = s1 \, \rightarrow \, s2 \, \wedge \, s1 \, \sim \, t1 \, \wedge \, s2 \, \sim \, t2)
  using cons-any-fun by blast
lemma ce-less-implies-cons-less:
  (S \vdash \tau \simeq \tau' \longrightarrow \$S \ \tau \sim \$S \ \tau') \land (S \vdash \tau \sqsubseteq \tau' \longrightarrow \$S \ \tau \sqsubseteq \tau')
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply force apply force apply force
  apply simp apply (rule CFun) apply simp apply simp
  apply simp using less-info-implies-consistent apply blast
  apply simp
  apply (frule less-info-implies-consistent)
  apply (frule consistent-symmetric) apply simp
  apply force+
  done
```

lemma cons-eq-implies-cons:

```
S \vdash \tau \simeq \tau' \Longrightarrow \$S \ \tau \sim \$S \ \tau'
  using ce-less-implies-cons-less by blast
lemma cons-less-implies-less:
  S \vdash \tau \sqsubseteq \tau' \Longrightarrow \$S \ \tau \sqsubseteq \tau'
  using ce-less-implies-cons-less by blast
lemma conseq-any-fun-var:
  S \vdash \tau \simeq \tau' \to UVarT \beta \Longrightarrow
   \tau = ? \lor (\exists t1 t2. \$S \tau = t1 \rightarrow t2 \land t1 \sim \$S \tau' \land t2 \sqsubseteq \%S \beta)
 apply (case-tac \tau)
 defer
 apply force
 apply force
 apply simp
 apply simp
 apply (erule conseq-fun-fun) apply (rule conjI)
 apply (rule cons-eq-implies-cons) apply simp
 apply (erule conseq-any-uvar)
   apply simp apply force
   apply (rule cons-less-implies-less) apply simp
   apply simp apply (erule consless-uvar-any) apply force
proof -
 fix \alpha assume ttb: S \vdash \tau \simeq \tau' \rightarrow UVarT \beta and t: \tau = UVarT \alpha
  from ttb t have tba: S \vdash \tau' \rightarrow UVarT \beta \sqsubseteq \%S \alpha
   apply simp apply (erule conseq-uvar-fun) by blast
  from tba obtain t1 t2 where tt1: S \vdash \tau' \sqsubseteq t1 and bt2: S \vdash UVarT \beta \sqsubseteq t2
   and sa: \%S \ \alpha = t1 \rightarrow t2 using consless-fun-var-any by blast
  from tt1 have S \tau' \sqsubseteq t1 by (rule cons-less-implies-less)
 hence t1t: t1 \sim \$ S \tau' using less-info-implies-consistent consistent-symmetric by blast
 from bt2 have \%S \beta = t2 by force
 hence t2sb: t2 \subseteq \%S \ \beta by force
 from t sa t1t t2sb
 show \tau = ? \lor (\exists t1 \ t2. \$S \ \tau = t1 \rightarrow t2 \land t1 \sim \$S \ \tau' \land t2 \sqsubseteq \%S \ \beta) by simp
qed
lemma conseq-any-fun-var-rule:
  [S \vdash \tau \simeq \tau' \rightarrow UVarT \beta;]
    \tau = ? \Longrightarrow P;
    \Longrightarrow P
  apply (frule conseq-any-fun-var) apply (erule disjE)
 apply simp
 apply (erule exE)+ apply simp apply clarify
 apply (case-tac ST) apply force apply force apply force apply force
 apply simp apply clarify apply simp
proof -
 fix t1 t2
 assume A: \land t1a \ t2a. \llbracket t1 = t1a \land t2 = t2a; \ t1a \sim \$ \ S \ \tau'; \ t2a \sqsubseteq \%S \ \beta \rrbracket \Longrightarrow P
   and B: t1 \sim \$ S \tau' and C: t2 \sqsubseteq \%S \beta
   from A[of\ t1\ t2]\ B\ C show P apply blast done
qed
lemma prop1-item-6-and-7-fwd:
  (S \vdash t1 \simeq t2 \longrightarrow FTV \ t1 = \{\} \land FTV \ t2 = \{\} \longrightarrow t1 \sim t2)
```

```
\land (S \vdash t1 \sqsubseteq t2 \longrightarrow FTV \ t1 = \{\} \longrightarrow t1 \sqsubseteq t2)
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply blast apply blast apply blast
  apply clarify apply simp apply (rule CFun) apply simp apply simp
  apply simp apply simp apply blast apply blast apply blast
  apply clarify apply (rule LEFun) apply simp apply simp
  done
lemma prop1-item-6-back:
  t1 \sim t2 \Longrightarrow FTV \ t1 = \{\} \land FTV \ t2 = \{\} \longrightarrow (\forall S. S \vdash t1 \simeq t2)
  apply (induct rule: consistent.induct)
  apply clarify apply (rule conseq-refl)
  apply clarify apply (rule CEFun) apply simp apply simp
  apply blast apply blast done
lemma ftv-empty-subst-id[rule-format]:
  \forall S. FTV \ \tau = \{\} \longrightarrow \$S \ \tau = (\tau :: ty)
  apply (induct \tau) by auto
lemma prop1-item-7-back:
  t1 \sqsubseteq t2 \Longrightarrow FTV \ t1 = \{\} \longrightarrow (\forall S. S \vdash t1 \sqsubseteq t2)
  apply (induct rule: less-info.induct)
  apply blast
  apply blast
  defer
  apply clarify apply (rule CLFun) apply simp apply simp
  apply blast
  apply auto
  done
lemma widen-conseq-consless:
  (S \vdash \tau_1 \simeq \tau_2 \longrightarrow (\forall \alpha. \ \alpha \in FTV \ \tau_1 \cup FTV \ \tau_2 \longrightarrow \%S' \ \alpha = \%S \ \alpha)
         \longrightarrow S' \vdash \tau_1 \simeq \tau_2
  \wedge \ (S \vdash \tau_1 \sqsubseteq \tau_2 \xrightarrow{\cdot} ( \  \, \forall \, \alpha. \,\, \alpha \in FTV \,\, \tau_1 \longrightarrow \%S' \,\, \alpha = \%S \,\, \alpha)
         \longrightarrow S' \vdash \tau_1 \sqsubseteq \tau_2
  apply (induct rule: consistent-equal-consistent-less.induct)
  apply force+ done
lemma widen-conseq:
  \llbracket \ S \vdash \tau_1 \simeq \tau_2; \ (\forall \ \alpha. \ \alpha \in FTV \ \tau_1 \cup FTV \ \tau_2 \longrightarrow \%S' \ \alpha = \%S \ \alpha) \ \rrbracket
  \implies S' \vdash \tau_1 \simeq \tau_2
  using widen-conseq-consless by blast
lemma widen-consless:
  \llbracket S \vdash \tau_1 \sqsubseteq \tau_2; (\forall \alpha. \ \alpha \in FTV \ \tau_1 \longrightarrow \%S' \ \alpha = \%S \ \alpha) \rrbracket \Longrightarrow S' \vdash \tau_1 \sqsubseteq \tau_2
  using widen-conseq-consless by blast
           The Gradual Type System with Type Variables
inductive igtlc\text{-}wt :: [subst,env,nat,nat] \Rightarrow [expr,ty] \Rightarrow bool (-;-;-;-\vdash_q -: -[52,52,52,52,52,52] 51)
where
  GVar[intro!]: \llbracket lookup \ \Gamma \ x = Some \ \tau \ \rrbracket \Longrightarrow S; \Gamma; n; n \vdash_q Var \ x : \tau \mid
  GConst[intro!]: S;\Gamma;n;n \vdash_q Const \ c : TypeOf \ c \mid
  GAbs[intro!]: \llbracket S;(x,\tau_1) \# \Gamma; m; n \vdash_g e : \tau_2 \rrbracket \Longrightarrow S; \Gamma; m; n \vdash_g (\lambda x : \tau_1. \ e) : \tau_1 \to \tau_2 \mid
```

```
GApp[intro!]: [S;\Gamma;n0;n1 \vdash_g e : \tau_1; S;\Gamma;n1;n2 \vdash_g e' : \tau_2;
                       S \vdash \tau_1 \simeq (\tau_2 \to UVarT \ n2) \ 
               \implies S;\Gamma;n0;Suc\ n2 \vdash_q (App\ e\ e'): UVarT\ n2
\mathbf{lemma}\ \mathit{ftv-env-ftv-ty}[\mathit{rule-format}]:
  \forall \ x \ \tau. \ lookup \ \Gamma \ x = Some \ \tau \longrightarrow \mathit{FTV} \ \tau \subseteq \mathit{FTV} \ \Gamma
  apply (induct \Gamma) by auto
lemma igtlc-fresh-grows:
  S;\Gamma;m;n\vdash_q e:\tau\Longrightarrow m\leq n
  apply (induct rule: igtlc-wt.induct)
  \mathbf{apply}\ \mathit{simp} + \mathbf{done}
lemma igtlc-ftv-result:
  S;\Gamma;m;n\vdash_q e:\tau \Longrightarrow (\forall \alpha.\ \alpha\in FTV\ \tau\longrightarrow \alpha\in FTV\ \Gamma\cup FTV\ e\lor (m\le\alpha\land\alpha< n))
  (is S;\Gamma;m;n\vdash_q e:\tau\Longrightarrow ?PS\Gamma\ m\ n\ e\ \tau)
  apply (induct rule: igtlc-wt.induct)
  apply clarify apply simp using ftv-env-ftv-ty apply blast
  apply simp apply clarify apply (case-tac c) apply simp apply simp apply simp apply simp
proof -
  fix S \Gamma \tau_1 \tau_2 e m n x
  assume S;(x, \tau_1)\#\Gamma; m; n \vdash_g e : \tau_2
    and IH: \forall \alpha. \ \alpha \in FTV \ \tau_2 \longrightarrow \alpha \in FTV \ ((x, \tau_1) \# \Gamma) \cup FTV \ e \lor m \le \alpha \land \alpha < n
  show ?P S \Gamma m n (\lambda x:\tau_1. e) (\tau_1 \rightarrow \tau_2)
    apply (rule \ all I) apply (rule \ imp I)
  proof -
    fix \alpha assume af12: \alpha \in FTV \ (\tau_1 \to \tau_2)
    from af12 have \alpha \in FTV \ \tau_1 \lor \alpha \in FTV \ \tau_2 by simp
    moreover { assume af1: \alpha \in FTV \ \tau_1
       from af1 have \alpha \in FTV (\lambda x:\tau_1. e) by simp
       hence \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x : \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ \text{by } simp
     } moreover { assume af2: \alpha \in FTV \ \tau_2
       from af2 IH have \alpha \in FTV ((x,\tau_1)\#\Gamma) \cup FTV e \vee m \leq \alpha \wedge \alpha < n by simp
       moreover { assume \alpha \in FTV ((x, \tau_1) \# \Gamma)
         hence \alpha \in FTV \ \Gamma \lor \alpha \in FTV \ \tau_1 apply (simp add: FTV-pair) by blast
         hence \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x : \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ \text{by force}
       } moreover { assume \alpha \in FTV \ e
         hence \alpha \in FTV \ (\lambda x : \tau_1. \ e) by simp
         hence \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x : \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ \text{by} \ simp
       } moreover { assume m \leq \alpha \land \alpha < n
         hence \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x: \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ \text{by } simp
       } ultimately have \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x: \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ by \ blast
    } ultimately show \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x : \tau_1. \ e) \lor m \le \alpha \land \alpha < n \ by \ blast
  qed
next
  fix S \Gamma \tau_1 \tau_2 e e' n0 n1 n2
  assume wte: S;\Gamma;n\theta;n1 \vdash_g e : \tau_1
    and IH1: \forall \alpha. \ \alpha \in FTV \ \tau_1 \longrightarrow \alpha \in FTV \ \Gamma \cup FTV \ e \lor n0 \le \alpha \land \alpha < n1
    and wtep: S;\Gamma;n1;n2 \vdash_q e' : \tau_2
    and IH2: \forall \alpha. \alpha \in FTV \ \tau_2 \longrightarrow \alpha \in FTV \ \Gamma \cup FTV \ e' \lor n1 \le \alpha \land \alpha < n2
    and s12b: S \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT \ n2
  show \forall \alpha. \ \alpha \in FTV \ (UVarT \ n2) \longrightarrow \alpha \in FTV \ \Gamma \cup FTV \ (App \ e \ e') \lor n0 \le \alpha \land \alpha < Suc \ n2
    apply (rule \ all I) apply (rule \ imp I)
  proof -
    fix \alpha assume \alpha \in FTV (UVarT n2) hence an2: \alpha = n2 by simp
```

```
from an 2 have asn 2: \alpha < Suc \ n2 by simp
    from wte have n0n1: n0 \le n1 by (rule igtlc-fresh-grows)
    from wtep have n1n2: n1 \le n2 by (rule igtlc-fresh-grows)
    from n0n1 n1n2 an2 have n0a: n0 \le \alpha by simp
    from n\theta a asn2
    show \alpha \in FTV \ \Gamma \cup FTV \ (App \ e \ e') \lor n0 \le \alpha \land \alpha < Suc \ n2 \ by \ simp
  qed
qed
lemma widen-subst-impl:
  S;\Gamma;m;n\vdash_q e:\tau\Longrightarrow
   (\forall \ \alpha. \ \alpha \in \mathit{FTV} \ \Gamma \cup \mathit{FTV} \ e \ \lor \ (m \leq \alpha \land \alpha < n) \longrightarrow \%S' \ \alpha = \%S \ \alpha)
        \rightarrow S'; \Gamma; m; n \vdash_g e : \tau
  (is S;\Gamma;m;n\vdash_q e:\tau \Longrightarrow ?PS\Gamma mne\tau)
  apply (induct rule: iqtlc-wt.induct)
  apply force
  apply force
proof -
  fix S \Gamma \tau_1 \tau_2 e m n x
  assume S;(x,\tau_1)\#\Gamma;m;n\vdash_g e:\tau_2
    and IH: (\forall \alpha. \ \alpha \in FTV \ ((x,\tau_1)\#\Gamma) \cup FTV \ e \lor m \le \alpha \land \alpha < n \longrightarrow \%S' \ \alpha = \%S \ \alpha) \longrightarrow
          S';(x, \tau_1)\#\Gamma; m; n \vdash_g e : \tau_2
  show (\forall \alpha. \ \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x:\tau_1. \ e) \lor m \le \alpha \land \alpha < n \longrightarrow \%S' \ \alpha = \%S \ \alpha) \longrightarrow
            S';\Gamma;m;n\vdash_g \lambda x:\tau_1.\ e:\tau_1\to\tau_2
  proof clarify
    assume f!: \forall \alpha. \ \alpha \in FTV \ \Gamma \cup FTV \ (\lambda x: \tau_1. \ e) \ \lor \ m \le \alpha \land \alpha < n \longrightarrow \%S' \ \alpha = \%S \ \alpha
    \textbf{from} \ f\! l \ \textbf{have} \ (\forall \, \alpha. \ \alpha \in FTV \ ((x, \, \tau_1) \# \Gamma) \ \cup \ FTV \ e \ \lor \ m \ \leq \alpha \ \land \ \alpha \ < n \ \longrightarrow \ \%S' \ \alpha = \%S \ \alpha)
       apply clarify apply (erule disjE)
         apply simp apply (erule \ disjE)
           apply (erule-tac x=\alpha in all E) apply (simp add: FTV-pair)
            apply blast
         apply blast
       done
    with IH show S'_{:}(x, \tau_1) \# \Gamma; m; n \vdash_q e : \tau_2 by simp
  qed
next
  fix S \Gamma \tau_1 \tau_2 e e' n0 n1 n2
  assume wte: S;\Gamma;n\theta;n1 \vdash_g e : \tau_1
    and IH1: ?P S \Gamma n0 n1 e \tau_1
    and wtep: S;\Gamma;n1;n2 \vdash_q e': \tau_2
    and IH2: ?P S \Gamma n1 n2 e' \tau_2
    and st12b: S \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT n2
  show ?P S \Gamma n\theta (Suc n2) (App e e') (UVarT n2)
  proof clarify
    assume fa: \forall \alpha. \ \alpha \in FTV \ \Gamma \cup FTV \ (App \ e \ e') \lor n0 \le \alpha \land \alpha < Suc \ n2 \longrightarrow \%S' \ \alpha = \%S \ \alpha
    from wte have n0n1: n0 \le n1 by (rule igtlc-fresh-grows)
    from wtep have n1n2: n1 \le n2 by (rule igtlc-fresh-grows)
    from fa n1n2
    have fe: (\forall \alpha. \ \alpha \in FTV \ \Gamma \cup FTV \ e \lor n\theta \le \alpha \land \alpha < n1 \longrightarrow \%S' \ \alpha = \%S \ \alpha) by simp
    from fe IH1 have wte2: S';\Gamma;n\theta;n1 \vdash_q e : \tau_1 by simp
    from fa \ n0n1
    have fep: (\forall \alpha. \ \alpha \in FTV \ \Gamma \cup FTV \ e' \lor n1 \le \alpha \land \alpha < n2 \longrightarrow \%S' \ \alpha = \%S \ \alpha) by simp
    from fep IH2 have wtep2: S';\Gamma;n1;n2 \vdash_g e': \tau_2 by simp
    from wte2 fe have aft1: (\forall \alpha. \alpha \in FTV \ \tau_1 \longrightarrow \%S' \ \alpha = \%S \ \alpha)
       using igtlc-ftv-result apply blast done
```

```
from wtep2 fep have aft2: (\forall \alpha. \alpha \in FTV \ \tau_2 \longrightarrow \%S' \ \alpha = \%S \ \alpha)
      using igtlc-ftv-result apply blast done
    from wte have n0n1: n0 \le n1 by (rule igtlc-fresh-grows)
    \textbf{from} \ \textit{wtep} \ \textbf{have} \ \textit{n1n2:} \ \textit{n1} \leq \textit{n2} \ \textbf{by} \ (\textit{rule igtlc-fresh-grows})
    from fa n0n1 n1n2 have (\forall \ \alpha. \ \alpha \in FTV \ (UVarT \ n2) \longrightarrow \%S' \ \alpha = \%S \ \alpha) by auto
    with aft1 aft2
    have aft12b: (\forall \alpha. \alpha \in FTV \ \tau_1 \cup FTV \ (\tau_2 \rightarrow UVarT \ n2) \longrightarrow \%S' \ \alpha = \%S \ \alpha) by simp
    from st12b aft12b have S' \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT \ n2 by (rule widen-conseq)
    with wte2 wtep2 show S';\Gamma;n\theta;Suc\ n2 \vdash_q App\ e\ e':\ UVarT\ n2 by blast
qed
\mathbf{lemma}\ widen	ext{-}subst:
  \llbracket S; \Gamma; m; n \vdash_q e : \tau; (\forall \alpha. \alpha \in FTV \ \Gamma \cup FTV \ e \lor (m \le \alpha \land \alpha < n) \longrightarrow \%S' \ \alpha = \%S \ \alpha) \ \rrbracket
     \Longrightarrow S';\Gamma;m;n\vdash_q e:\tau
  using widen-subst-impl by blast
 — Theorem 2
theorem igtlc-implies-gtlc:
  S;\Gamma;m;n\vdash_g e:\tau\Longrightarrow FTV\ \Gamma=\{\}\land FTV\ e=\{\}
   \longrightarrow (\exists \ \tau'. \ \Gamma \vdash_g e : \tau' \land \tau' \sqsubseteq \$S \ \tau)
  (is S;\Gamma;m;n\vdash_g e:\tau\Longrightarrow ?PS\Gamma\ e\ \tau)
proof (induct rule: igtlc-wt.induct)
  fix \Gamma::env and \tau and x and S n assume gx: lookup \Gamma x = Some \tau
  show ?P S \Gamma (Var x) \tau
  proof clarify
    assume fg: FTV \Gamma = \{\}
    from gx fg have FTV \tau = \{\} using ftv-env-ftv-ty by blast
    hence \forall a. a \in FTV \ \tau \longrightarrow \%S \ a = UVarT \ a \ \textbf{by} \ simp
    hence S = \tau using ftv-dom-id by blast
    hence \tau \sqsubseteq \$S \ \tau apply simp by (rule\ less-info-refl)
    with gx show \exists \tau'. \Gamma \vdash_g Var x : \tau' \land \tau' \sqsubseteq \$ S \tau by blast
  qed
next
  fix S \Gamma c show ?P S \Gamma (Const c) (TypeOf c) by auto
next
  fix S::subst and x \tau_1 and \Gamma::env and m \ n \ e \ \tau_2
  assume IH: ?P S ((x,\tau_1)\#\Gamma) e \tau_2
  show ?P S \Gamma (\lambda x : \tau_1. e) (\tau_1 \to \tau_2)
  proof clarify
    assume fg: FTV \Gamma = \{\} and fl: FTV (\lambda x:\tau_1, e) = \{\}
    from fl have ft: FTV \tau_1 = \{\} by simp
    with fg have fg2: FTV ((x,\tau_1)\#\Gamma) = \{\} by (simp\ add:\ FTV-fun)
    from fl have fe: FTV e = \{\} by simp
    from fg2 fe IH obtain \tau' where wte: (x,\tau_1)\#\Gamma \vdash_g e : \tau'
      and tpst2: \tau' \sqsubseteq \$S \ \tau_2 \ by \ blast
    from ft have \forall a. a \in FTV \ \tau_1 \longrightarrow \%S \ a = UVarT \ a \ by \ simp
    hence S \tau_1 = \tau_1 using ftv-dom-id by blast
    with tpst2 have stt: \tau_1 \to \tau' \sqsubseteq \$S \ (\tau_1 \to \tau_2)
      apply simp apply (rule LEFun) apply (rule less-info-reft) apply simp done
    from wte have \Gamma \vdash_g \lambda x : \tau_1.\ e : \tau_1 \to \tau' by blast
    with stt show \exists \tau'. \Gamma \vdash_g \lambda x : \tau_1. e : \tau' \land \tau' \sqsubseteq \$S \ (\tau_1 \to \tau_2)
      apply (rule-tac x=\tau_1 \to \tau' in exI)
      apply simp done
  qed
```

```
next
  fix S \Gamma n0 n1 e \tau_1 n2 e' \tau_2
 assume IH1: ?P S \Gamma e \tau_1
    and IH2: ?P S \Gamma e' \tau_2
    and st12b: S \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT \ n2
  show ?P S \Gamma (App \ e \ e') (UVarT \ n2)
  proof clarify
    assume fg: FTV \Gamma = \{\} and fa: FTV (App \ e \ e') = \{\}
    from fa have fe: FTV e = \{\} by simp
    with fg IH1 obtain t1 where wte: \Gamma \vdash_q e : t1 and t11: t1 \sqsubseteq \$S \tau_1 by blast
    from fa have fep: FTV e' = \{\} by simp
    with fg IH2 obtain t2 where wtep: \Gamma \vdash_q e': t2
     and st2: t2 \sqsubseteq \$S \ \tau_2 by blast
    from st12b show \exists \tau'. \Gamma \vdash_a App \ e \ e' : \tau' \land \tau' \sqsubseteq \$ \ S \ (UVarT \ n2)
    proof (rule conseq-any-fun-var-rule)
      assume t1d: \tau_1 = ?
      with t11 have T1d: t1 = ? by auto
      from wte T1d have wte2: \Gamma \vdash_q e: ? by simp
      with wtep have A: \Gamma \vdash_g App \ e \ e': ? by blast
      have B: ? \sqsubseteq \$S (UVarT n2) by blast
      from A B show ?thesis by blast
    next
      fix t11 t12 assume st1: S \tau_1 = t11 \rightarrow t12 and t11st2: t11 \sim S \tau_2
        and t2sb: t12 \sqsubseteq \%S \ n2
      from t11 \ st1 have t1-le-t12: t1 \sqsubseteq t11 \rightarrow t12 by simp
      from t11st2 have st2t11: $ S \tau_2 \sim t11 by (rule consistent-symmetric)
      from t1-le-t12 show ?thesis
      proof (rule le-any-fun)
        fix \sigma \sigma' assume st11: \sigma \sqsubseteq t11 and spt12: \sigma' \sqsubseteq t12
          and T1: t1 = \sigma \rightarrow \sigma'
        with wte have wte2: \Gamma \vdash_g e : \sigma \to \sigma' by simp
       from st2 st2t11 have t2t11: t2 \sim t11 by (rule less-cons-implies-cons)
       hence t11t2: t11 \sim t2 by (rule consistent-symmetric)
        from st11 t11t2 have \sigma \sim t2 by (rule less-cons-implies-cons)
       hence t2s: t2 \sim \sigma by (rule consistent-symmetric)
        from wte2 wtep t2s have A: \Gamma \vdash_q App \ e \ e' : \sigma' by blast
        from spt12\ t2sb have \sigma' \sqsubseteq \%S\ n2 by (rule\ less-info-transitive)
       hence B: \sigma' \sqsubseteq \$S (UVarT \ n2) by simp
        from A B show \exists \tau'. \Gamma \vdash_g App \ e \ e' : \tau' \land \tau' \sqsubseteq \$ \ S \ (\textit{UVarT n2}) by \textit{blast}
      next
       assume T1d: t1 = ?
       from wte T1d have wte2: \Gamma \vdash_g e: ? by simp
        with wtep have A: \Gamma \vdash_g App \ e \ e': ? by blast
        have B: ? \sqsubseteq \$S (UVarT n2) by blast
        from A B show ?thesis by blast
      qed
    qed
 qed
qed
lemma lookup-subst-subst:
  lookup \ \Gamma \ x = Some \ \tau \Longrightarrow lookup \ (\$ \ S \ \Gamma) \ x = Some \ (\$ \ S \ \tau)
  apply (induct \Gamma)
 apply \ simp
```

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apply (case-tac a) apply (case-tac aa = x)
    apply (simp add: app-subst-pair)
    apply (simp add: app-subst-pair)
  done
— Part 1 of Theorem 3 of the paper
theorem igtlc-wt-implies-gtlc:
  S;\Gamma;m;n\vdash_g e:\tau\Longrightarrow (\exists \ \tau'.\ \$S\ \Gamma\vdash_g \$S\ e:\tau'\wedge\tau'\sqsubseteq\$S\ \tau)
proof (induct rule: igtlc-wt.induct)
  fix \Gamma::env and \tau x S n assume lookup \Gamma x = Some \tau
  thus \exists \tau'. S \Gamma \vdash_q S S (Var x) : \tau' \land \tau' \sqsubseteq S \tau
    apply simp \text{ apply } (rule\text{-}tac \ x=\$S \ \tau \text{ in } exI) \text{ apply } (rule \ conjI)
    apply (rule WTVar) apply (simp add: lookup-subst-subst) apply blast done
next
  fix S \Gamma n c show \exists \tau'. S \Gamma \vdash_q S S (Const c) : \tau' \land \tau' \sqsubseteq S (TypeOf c)
    apply simp apply blast done
next
  fix S x \tau_1 \Gamma m n e \tau_2
  assume IH: \exists \tau'. \$ S ((x,\tau_1)\#\Gamma) \vdash_g \$ S e : \tau' \land \tau' \sqsubseteq \$ S \tau_2
  from IH obtain \tau' where wte: S((x,\tau_1)\#\Gamma) \vdash_g S(e:\tau')
    and tst: \tau' \sqsubseteq \$ S \tau_2 by blast
  from wte have (x,\$S \ \tau_1)\#(\$ \ S \ \Gamma) \vdash_g \$ \ S \ e : \tau' by (simp \ only: \ subst-extend-env)
  hence wtl: S \Gamma \vdash_g (\lambda x: S \tau_1. S e) : (S \tau_1) \to \tau' by blast
  from tst have S \tau_1 \to \tau' \sqsubseteq S (\tau_1 \to \tau_2) by auto
  with wtl show \exists \tau'. S \Gamma \vdash_g S S (\lambda x : \tau_1. \ e) : \tau' \wedge \tau' \sqsubseteq S S (\tau_1 \to \tau_2)
    apply (rule-tac x=\$S \ \tau_1 \to \tau' \ \text{in } exI) by auto
next
  \mathbf{fix}\ S\ \Gamma\ n0\ n1\ e\ \tau_1\ n2\ e'\ \tau_2
  assume IH1: \exists \tau'. S \Gamma \vdash_g S E : \tau' \land \tau' \sqsubseteq S T_1
    and IH2: \exists \tau'. \$ S \Gamma \vdash_g \$ S e' : \tau' \land \tau' \sqsubseteq \$ S \tau_2
    and t123: S \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT \ n2
  from IH1 obtain t1' where wte: S \Gamma \vdash_q S S e : t1'
    and t1st: t1' \sqsubseteq \$ S \tau_1 by blast
  from IH2 obtain t2' where wtep: \$S \Gamma \vdash_q \$S e': t2'
    and tpst2: t2' \sqsubseteq \$ S \tau_2 by blast
  from t123 show \exists \tau'. $ S \Gamma \vdash_q \$ S (App \ e \ e') : \tau' \land \tau' \sqsubseteq \$ S (UVarT \ n2)
  proof (rule conseq-any-fun-var-rule)
    assume t1: \tau_1 = ?
    from t1 t1st have t1p: t1' = ? by auto
    with wte have wte: S \Gamma \vdash_q S S e : ? by simp
    from wte wtep have S \Gamma \vdash_g App (S e) (S e') : ? by (rule\ WTApp1)
    thus \exists \tau'. $ S \Gamma \vdash_g \$ S (App \ e \ e') : \tau' \wedge \tau' \sqsubseteq \$ S (UVarT \ n2) apply simp \ by \ blast
  next
    fix t1 t2
    assume st1: S \tau_1 = t1 \rightarrow t2 and t1s: t1 \sim S \tau_2 and t2b: t2 \subseteq S \tau_2
    from t1st\ st1 have t1p12:\ t1'\sqsubseteq t1\to t2 by simp
    hence t1' = ? \lor (\exists t11 \ t12. \ t1' = t11 \rightarrow t12) using le-any-fun by blast
    moreover { assume t1p: t1' = ?
      with wte have wte: S \Gamma \vdash_q S S e : ? by simp
      from wte wtep have S \Gamma \vdash_g App (S e) (S e') : ? by (rule WTApp1)
      hence \exists \tau'. S \Gamma \vdash_q S S (App \ e \ e') : \tau' \wedge \tau' \sqsubseteq S (UVarT \ n2)
        apply simp by blast
    } moreover { assume X: \exists t11 t12. t1' = t11 \rightarrow t12
      from X obtain t11 t12 where T1: t1' = t11 \rightarrow t12 by blast
      from T1 \ t1p12 have t11t1: t11 \sqsubseteq t1 by blast
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from T1 t1p12 have t12t2: t12 \sqsubseteq t2 by blast
     from wte T1 have wte2: S \Gamma \vdash_g S S e : t11 \rightarrow t12 by simp
     from t11t1 t1s have t11st2: t11 \sim $S \tau_2 by (rule less-cons-implies-cons)
     hence st2t11: S \tau_2 \sim t11 by (rule consistent-symmetric)
     from tpst2 st2t11 have t2t11: t2' \sim t11 by (rule less-cons-implies-cons)
     from wte2 wtep t2t11 have wta: S \Gamma \vdash_q App (S e) (S e') : t12
       by (rule\ WTApp2)
     from t12t2\ t2b have t12b: t12 \subseteq \%S\ n2 by (rule less-info-transitive)
     from wta t12b
     have \exists \tau'. \$ S \Gamma \vdash_q \$ S (App \ e \ e') : \tau' \wedge \tau' \sqsubseteq \$ S (UVarT \ n2)
       apply simp by blast
   } ultimately show \exists \tau'. $ S \Gamma \vdash_q \$ S (App \ e \ e') : \tau' \wedge \tau' \sqsubseteq \$ S (UVarT \ n2)
     by blast
 qed
qed
lemma no-dyn-lookup:
  \bigwedge x \tau. \llbracket lookup \Gamma x = Some \tau; no-dyn \Gamma \rrbracket \Longrightarrow no-dyn \tau
 apply (induct \Gamma)
  apply simp
 apply simp apply (case-tac a) apply simp
   apply (case-tac no-dyn b) apply simp
   apply (case-tac aa = x) apply simp
   apply simp apply simp
  done
— This is Theorem 4 of the paper
theorem igtlc-wt-no-dyn-implies-istlc:
  S; \Gamma; m; n \vdash_g e : \tau \Longrightarrow \textit{no-dyn} \ \Gamma \ \land \ \textit{no-dyn} \ e \longrightarrow S; \Gamma \vdash e : \tau \ \land \ \textit{no-dyn} \ \tau
 apply (induct rule: igtlc-wt.induct)
  apply clarify apply (rule conjI) apply force
   apply (simp add: no-dyn-lookup)
  apply clarify apply (rule conjI) apply force
   apply (simp add: no-dyn-lookup)
   apply (case-tac c) apply simp apply simp apply simp apply simp
  apply clarify apply (rule conjI)
   apply clarify apply (erule impE) apply (simp add: no-dyn-fun)
   apply (case-tac no-dyn \tau_1) apply simp apply simp
   apply clarify
  apply (erule impE) apply simp apply (case-tac no-dyn \tau_1)
   apply simp apply simp apply (case-tac no-dyn \tau_1) apply simp apply simp
  apply clarify
proof -
  fix S \Gamma n0 n1 e \tau_1 n2 e' \tau_2
  assume st12b: S \vdash \tau_1 \simeq \tau_2 \rightarrow UVarT \ n2 and ndg: no\text{-}dyn \ \Gamma
   and nda: no-dyn (App e e')
   and IH1: no-dyn \Gamma \wedge no-dyn e \longrightarrow S; \Gamma \vdash e : \tau_1 \wedge no-dyn \tau_1
   and IH2: no-dyn \Gamma \wedge no-dyn e' \longrightarrow S; \Gamma \vdash e' : \tau_2 \wedge no-dyn \tau_2
  from ndg nda IH1 have wte: S; \Gamma \vdash e : \tau_1 by auto
  from ndg \ nda \ IH1 have ndt1: no\text{-}dyn \ \tau_1 by auto
  from ndg nda IH2 have wtep: S;\Gamma \vdash e' : \tau_2 apply auto apply (case-tac no-dyn e)
   apply simp apply simp done
  from ndg nda IH2 have ndt2: no-dyn \tau_2 apply auto apply (case-tac no-dyn e)
   apply simp apply simp done
  from ndt2 have ndt2b: no\text{-}dyn\ (\tau_2 \to \textit{UVarT}\ n2) by simp
```

```
from st12b ndt1 ndt2b have st1t2b: $S \ \tau_1 = $S \ (\tau_2 \to UVarT \ n2)$ by (rule\ conseq-no-dyn-equal) from wte\ wtep\ st1t2b show S;\Gamma \vdash App\ e\ e':\ UVarT\ n2 \land no-dyn\ (UVarT\ n2) by force qed
```

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