## Back to the 90s!

Fast Indexing for Search by Types

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Every programmer has encountered this problem once: I'm looking for a function that does X, where to find it?

Often there is an "intuitive" approach: I want a function on time, I look in the Time module. This does not always work (auxiliary modules ...).

 $\Rightarrow$  We can search functions using a very familiar abstraction: their types!

## Our tool: Dowsing!

- Finds types "up to" order of arguments, instantiation, ....
- Knows about packages/libraries
- Scales to modern ecosystems (for instance, opam)

```
$ search "'a list * 'a -> bool"
. . .
List.mem : 'a -> 'a list -> bool
. . .
$ search "'a list -> ('a * 'b -> 'b) -> 'b -> 'b"
. . .
List.fold_left :
  ('a -> 'b -> 'a) -> 'a -> 'b list -> 'a
List.fold_right :
  ('a -> 'b -> 'b) -> 'a list -> 'b -> 'b
. . .
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. . .
  How does it all work ?
```



Search by type modulo isomorphism:

- $\bullet\,$  Sound and complete  $\checkmark\,$
- Computationally intensive X

Hoogle (https://hoogle.haskell.org/):

- Neither sound nor complete (more like "text search in types") X
- Scales well 🖌

Given a type  $\tau$ , finds all functions in the libraries with types which are equivalent/match/unify to  $\tau$  up to some set of "simplifications".

We consider the following simplifications (i.e., isomorphisms):

$$\begin{aligned} a \times b \equiv_{T} b \times a & (\times \text{-comm}) \\ a \times (b \times c) \equiv_{T} (a \times b) \times c & (\times \text{-assoc}) \\ \text{unit} \times a \equiv_{T} a & (\times \text{-unit}) \\ (a \times b) \to c \equiv_{T} a \to (b \to c) & (\text{curry}) \end{aligned}$$

Problem: Unification/Matching modulo isomorphism is expensive.

Some remarks:

- When searching, many types do not match
- Even when failing, unification is expensive
- Performance of unification highly depends on the types (more than \*1000 variance)

Battle plan:

- 1. Experimentally measure to identify types taking lots of time
- 2. Introduces "shortcuts", to skip unification for these expensive types
- 3. Pre-process the database of types to compute shortcuts in advance
- 4. Rinse and repeat

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## First metric: Number of unique variables

Exemples:

- $vars(\alpha \rightarrow \alpha) = 1$
- $vars((\alpha \rightarrow \beta \rightarrow \alpha) \rightarrow \alpha \rightarrow list(\beta) \rightarrow \alpha) = 2$

stats "int -> int -> int" -measure unique-vars

| vars | total time ( <i>ms</i> ) | avg. time ( $\mu s$ ) | nb. unif. |
|------|--------------------------|-----------------------|-----------|
| 0    | 53.8554                  | 1.28044               | 42060     |
| 1    | 76.8702                  | 8.60038               | 8938      |
| 2    | 68.7156                  | 18.6575               | 3683      |
| 3    | 10.241                   | 9.16014               | 1118      |
| 4    | 3.55721                  | 12.3514               | 288       |

Observations:

- 75% unifs/ 25% time without any variables
- Unification on polymorphic type is harder

## Second of metric: The head

Exemples:

- $head(unit \rightarrow \alpha) = var$
- head(int  $\rightarrow$  int  $\rightarrow$  list( $\alpha$ )) = cons<sub>list</sub>

#### stats "int -> int -> int" -measure head

| vars        | total time ( <i>ms</i> ) | avg. time ( $\mu s$ ) | nb. unif. |
|-------------|--------------------------|-----------------------|-----------|
| variable    | 88.8178                  | 39.7218               | 2236      |
| constructor | 80.8148                  | 1.77701               | 45478     |
| tuple       | 16.0539                  | 1.91574               | 8380      |
| other       | 0.442982                 | 1.91767               | 231       |

Observations:

- 95% with a simple constructor at the head
- Case with variable head are pathological

We have many other metrics. It's very easy to implement new ones.

Preliminary conclusions:

- Cheap cases (no variables, simple head, ...)
   ⇒ Still many of them, Easy to skip
- Expansive cases (Too many variables, lot's of sharing)
   ⇒ Hard to skip, but skips are very worthwhile

We are looking for criterions that are necessary (but not sufficient!).

A criterion is composed of:

- A domain of values D
- encode : Types  $\rightarrow D$
- $compat: D \times D \rightarrow Bool$
- $\tau_1 \equiv_T \tau_2 \implies compat(encode(\tau_1), encode(\tau_2))$

We thus get a filter!

 $\neg$ (compat(encode( $\tau_1$ ), encode( $\tau_2$ )))  $\implies \tau_1 \not\equiv_T \tau_2$ 

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If two types have incompatible heads, they can never unify:

- $\cdots \rightarrow int \not\equiv_T \cdots \rightarrow float$
- $\cdots \rightarrow list(\alpha) \not\equiv_T \cdots \rightarrow int \times int$
- $\cdots \rightarrow int \stackrel{?}{\equiv}_T \cdots \rightarrow \alpha$

We precompute the heads for all types in the database and store them compactly

# Searching in a local install of opam: $\sim 250$ packages, 31578 functions

| Туре   | Nb unif. w shortcut | Gain  |
|--|---------------------|-------|
| int  ightarrow int  ightarrow int  | 2714                | 91.4% |
| $\mathit{int}  ightarrow \mathit{int}  ightarrow \mathit{int}  ightarrow \mathit{int}$ | 2714                | 91.4% |
| int 	o (int 	o int) 	o list(lpha)  | 2945                | 90.7% |
| $\mathit{int}  ightarrow \mathit{float}  ightarrow \mathit{bool}  ightarrow unit$      | 5745                | 81.8% |
| $lpha  ightarrow {\it int}  ightarrow {\it unit}$                                      | 5745                | 81.8% |
| int  ightarrow int  ightarrow lpha   | 31578               | 0%    |

- We correctly avoid many unifications
- We need to work more for polymorphic queries

## **Unification criterion – Multiplicity**

If multiplicities are incompatible, types can never unify:

| int  ightarrow int  ightarrow int  ot  ot = 	au  | multiplicity = 2                         |
|--|--|
| int  ightarrow float   | multiplicity = 1                         |
| $int  ightarrow int  ot \equiv_{\mathcal{T}}$  | multiplicity = 1                         |
| int  ightarrow int  ightarrow lpha  ightarrow lpha   | $multiplicity \ge 2$                     |
| int  ightarrow (unit  ightarrow unit)  ightarrow unit  ot  ot  ot  ot  ot  ot  ot  ot  ot  o | multiplicity = 2<br>$multiplicity \ge 3$ |
| $int  ightarrow list(eta)  ightarrow int \stackrel{?}{\equiv}_{T}$                           | multiplicity = 2                         |
| int  ightarrow lpha  | $multiplicity \ge 1$                     |

# Searching in a local install of opam: $\sim 250$ packages, 31578 functions

| Туре   | Nb unif. w shortcut | Gain   |
|--|---------------------|--------|
| $\mathit{int}  ightarrow \mathit{int}  ightarrow \mathit{int}$                         | 121                 | 99.62% |
| $\mathit{int}  ightarrow \mathit{int}  ightarrow \mathit{int}  ightarrow \mathit{int}$ | 107                 | 99.66% |
| int 	o (int 	o int) 	o list(lpha)  | 141                 | 99.55% |
| $\mathit{int}  ightarrow \mathit{float}  ightarrow \mathit{bool}  ightarrow unit$      | 126                 | 99.6%  |
| $lpha  ightarrow {\it int}  ightarrow {\it unit}$                                      | 2443                | 92.26% |
| $\mathit{int}  ightarrow \mathit{int}  ightarrow lpha$                                 | 3677                | 88.36% |

- Combined with the previous criterion!
- Now decent at polymorphic queries

We introduced more shortcuts and plan to investigate even more (for instance, the relative positions of variables)

How to combine them? We use a trie-like structure of "features".

## Updated criterion:

- A domain of values D
- $compat: D \times D \rightarrow Bool$
- ...
- An order on D such that compat is monotonous

A trie of criterions:

- Given some criterions, we associate types to words in  $\overline{D_i}$
- The database is stored as a trie of words
- Given a query (here, a constructor *f*), we recursively select all sub-tries with potentially valid types.



Some practical details on the implementation:

- Types are obtained by crawling the cmis
- Types are turned into a normal form
  - Application is n-ary
  - Arguments are sorted and tuples are merged
  - Hash-consing *everywhere*
- Memory representation/storage of the database not optimized so far (marshal)
- Full modified AC-unification implemented for the "SML" fragment, using the Boudet Algorithm
- A fairly creative stacked-functor design for the trie with heterogeneous words

Benchmark on database containing containers, batteries and base:  $\sim$  10000 functions

| Туре  | Nb unif. w shortcuts | Time (ms) |
|---|----------------------|-----------|
| int  ightarrow int  ightarrow int   | 50                   | 0.368ms   |
| int  ightarrow int  ightarrow int  ightarrow int  | 45                   | 0.649ms   |
| $\mathit{int}  ightarrow (\mathit{int}  ightarrow \mathit{int})  ightarrow \mathit{list}(lpha)$ | 67                   | 0.415ms   |
| $\mathit{int}  ightarrow \mathit{float}  ightarrow \mathit{bool}  ightarrow unit$               | 62                   | 1.26ms    |
| $lpha  ightarrow {\it int}  ightarrow {\it unit}$   | 62                   | 0.592ms   |
| $\mathit{int}  ightarrow \mathit{int}  ightarrow lpha$  | 29                   | 0.393ms   |
| $\textit{list}(\alpha)  ightarrow \_  ightarrow lpha$   | 642                  | 391ms     |

 $\Rightarrow$  Instant in practice for many queries. Still work to do on very polymorphic queries

We believe we can push indexing much further!

- Add new measures and appropriate criterions
- Find other ways to shortcut unification
- Proper serialization format for the database

Example of shortcut we do not exploit yet:

• Given  $\tau_1$  more general than  $\tau_2$ , if another  $\tau$  unifies with  $\tau_2$ , it also unifies with  $\tau_1$ . We can compute the "more general" semi-lattice in advance, and use it to avoid unifications. Still many holes to fill on the type system and unification aspect

- We only cover the SML fragment. We are still missing polymorphic variants, objects, first class modules, (modular explicits), ... Make a Bet: Is everything still decidable?
- Type aliases are unfolded eagerly right now. Can we do better?
- The unification procedure is reasonably efficient, but not highly tuned.  $\Rightarrow$  In particular, we really want early exit

Additional ideas:

- Search type declarations modulo isomorphism
- Consider isomorphic algebraic data types
- Look at modules ...

There is also quite a lot of dev to do:

- Reuse the odoc infrastructure
- Plug this into opam Cl
- Develop a web-based frontend

We presented *Dowsing*, a new approach to search in libraries by types:

- Sound and complete
- Scales well to medium ecosystem (and beyond?)
- Good methodological approach to improve it further

Our technique is formalized and implemented: https://github.com/Drup/dowsing Still lot's of work to do to make this practical!

