

# On logic programming representations of lambda terms: de Bruijn indices, compression, type inference, combinatorial generation, normalization

Paul Tarau

Department of Computer Science and Engineering  
University of North Texas

PADL'2015

# Motivation

- $\lambda$ -terms provide a foundation to modern functional languages, type theory and proof assistants
- they are now part of mainstream programming languages including Java, C# and Apple's Swift – (even C++ 11)
- $\lambda$ -calculus is possibly the most heavily researched computational mechanism – newcomers beware!
- it is also **thrilling**: despite its apparent simplicity there are endless surprises at every turn
- Prolog's backtracking, sound unification and DCGs make it an ideal **meta-language** for studying various families of lambda terms
- our **double temptation**  $\Rightarrow$  while (re)visiting the use of logic programming as a modeling tool, we will lay down some building blocks of a *declarative playground* for  $\lambda$ -terms, types and combinators

# Outline

- 1 A compressed de Bruijn representation of lambda terms
- 2 Generating binary trees, lambda terms and types
- 3 Type Inference with logic variables
- 4 Generating special classes of lambda terms
- 5 Normal forms and normalization of lambda terms
- 6 Conclusion

# De Bruijn Indices

- a lambda term:  $\lambda a.(\lambda b.(a(b\ b))\ \lambda c.(a(c\ c))) \Rightarrow$
- in Prolog:  $I(A,a(I(B,a(A,a(B,B))),I(C,a(A,a(C,C))))$
- *de Bruijn Indices* provide a name-free representation of lambda terms
- terms that can be transformed by a renaming of variables ( $\alpha$ -conversion) will share a unique representation
  - variables following lambda abstractions are omitted
  - their occurrences are marked with positive integers *counting the number of lambdas until the one binding them* on the way up to the root of the term
- term with canonical names:  $I(A,a(I(B,a(A,a(B,B))),I(C,a(A,a(C,C)))) \Rightarrow$
- de Bruijn term:  $I(a(I(a(v(1),a(v(0),v(0)))),I(a(v(1),a(v(0),v(0))))))$
- note: we start counting up from 0
- closed terms: every variable occurrence belongs to a binder
- open terms: otherwise

# From de Bruijn terms to terms with canonical names

The predicate `b2l` converts from the de Bruijn representation to lambda terms whose canonical names are provided by logic variables. We will call them terms in *standard notation*.

```
b2l(A,T) :- b2l(A,T,_Vs).
```

```
b2l(v(I),V,Vs) :- nth0(I,Vs,V). % find binder
```

```
b2l(a(A,B),a(X,Y),Vs) :- b2l(A,X,Vs),b2l(B,Y,Vs).
```

```
b2l(l(A),l(V,Y),Vs) :- b2l(A,Y,[V|Vs]). % define binder
```

the inverse transformation is `l2b` → in the paper

```
?- LT = l(A, l(B, l(C, a(a(A, C), a(B, C))))),  
    l2b(LT, BT),  
    b2l(BT, LT1),  
    LT = LT1.
```

`LT = LT1,`

`LT1 = l(A, l(B, l(C, a(a(A, C), a(B, C))))),`

`BT = l(l(l(a(a(v(2), v(0)), a(v(1), v(0)))))).`

# Compressing $\lambda$ -terms



Figure: Random  $\lambda$ -terms have long necks ...



Figure: But they can be compressed!

$\lambda$ -term  $\Rightarrow$  compressed  $\lambda$ -term

# Compressed de Bruijn terms

- iterated  $\lambda$ s (represented as a block of constructors  $1/1$  in the de Bruijn notation) can be seen as a successor arithmetic representation of a number that counts them
- $\Rightarrow$  it makes sense to represent that number more efficiently in the usual binary notation!
- in de Bruijn notation, blocks of  $\lambda$ s can wrap either applications or variable occurrences represented as indices
- $\Rightarrow$  we need only two constructors:
  - $v/2$  indicating in a term  $v(K, N)$  that we have  $K \lambda$ s wrapped around the de Bruijn index  $v(N)$
  - $a/3$  indicating in a term  $a(K, X, Y)$  that  $K \lambda$ s are wrapped around the application  $a(X, Y)$
- we call the terms built this way with the constructors  $v/2$  and  $a/3$  *compressed de Bruijn terms*

# From de Bruijn to compressed

- b2c: by case analysis on v/1, a/2, l/1
- it counts the binders l/1 as it descends toward the leaves of the tree

b2c(v(X),v(0,X)).

b2c(a(X,Y),a(0,A,B)) :- b2c(X,A),b2c(Y,B).

b2c(l(X),R) :- b2c1(0,X,R).

b2c1(K,a(X,Y),a(K1,A,B)) :- up(K,K1),b2c(X,A),b2c(Y,B).

b2c1(K,v(X),v(K1,X)) :- up(K,K1).

b2c1(K,l(X),R) :- up(K,K1),b2c1(K1,X,R).

up(From,To) :- From >= 0, To is From + 1.

# From compressed to de Bruijn

- `c2b` reverses the effect of `b2c` by expanding the `K` in `v(K, N)` and `a(K, X, Y)` into `K+1` `l/1` binders
- `iterLam` performs this operation on both `v/2` and `a/3` terms

`c2b(v(K, X), R) :- X >= 0, iterLam(K, v(X), R).`

`c2b(a(K, X, Y), R) :- c2b(X, A), c2b(Y, B), iterLam(K, a(A, B), R).`

`iterLam(0, X, X).`

`iterLam(K, X, l(R)) :- down(K, K1), iterLam(K1, X, R).`

`down(From, To) :- From > 0, To is From - 1.`

# Generating binary trees

- binary trees are a member of the Catalan family of combinatorial objects
- compressed de Bruijn terms can be seen as binary trees decorated with integer labels
- with DCGs: a generator / recognizer of binary trees of a fixed size

```
scat(N,T) :-scat(T,N,0) .
```

```
scat(o) -->[ ] .
```

```
scat( (X->Y) ) -->down, scat(X) , scat(Y) .
```

```
?- scat(3,BT) .
```

```
BT = (o->o->o->o) ;
```

```
...
```

```
BT = ( ( (o->o)->o) ->o) .
```

also, DCGs express nicely 1-argument function compositions!

```
% from compressed deBruijn to standard and back
```

```
c21 --> c2b, b21.
```

```
12c --> 12b, b2c.
```

# Simple types

- *simple types*: binary trees built with the constructor “ $\rightarrow / 2$ ”
- empty leaves: representing the unique primitive type “ $\circ$ ”
- `extractType/2` works by turning each logical variable  $X$  into a pair  $_ : TX$ , where  $TX$  is a fresh variable denoting its type
- as logic variable bindings propagate between binders and occurrences, this ensures that types are consistently inferred

```
extractType(_ : TX, TX) :- !. % this matches leaf variables
extractType(l(_ : TX, A), (TX -> TA)) :- % lambda variable
    extractType(A, TA).
extractType(a(A, B), TY) :- % application
    extractType(A, (TX -> TY)),
    extractType(B, TX).
```

- binding with base type:

```
bindType(o) :- !.
bindType( (A -> B) ) :- bindType(A), bindType(B) .
```

# Ensuring types are acyclic terms

```
hasType(CTerm, Type) :-  
    c2l(CTerm, LTerm), % from compressed to standard  
    extractType(LTerm, Type),  
    acyclic_term(LTerm),  
    bindType(Type).
```

- typability of the term corresponding to the S combinator  
 $\lambda x_0. \lambda x_1. \lambda x_2. ((x_0\ x_2)\ (x_1\ x_2))$
- untypability of the term corresponding to the Y combinator  
 $\lambda x_0. (\lambda x_1. (x_0\ (x_1\ x_1))\ \lambda x_2. (x_0\ (x_2\ x_2)))$

```
?- hasType(a(3,a(0,v(0,2),v(0,0)),a(0,v(0,1),v(0,0))),T).  
T = ((o->o->o)-> (o->o)->o->o).
```

```
?- hasType(  
a(1,a(1,v(0,1),a(0,v(0,0),v(0,0))),a(1,v(0,1),a(0,v(0,0),v(0,0)))),T).  
false.
```

# Generating Motzkin trees

- Motzkin-trees (also called binary-unary trees) have internal nodes of arities 1 or 2
- ⇒ like lambda term trees, for which we ignore the de Bruijn indices that label their leaves

```
motzkinTree(L, T) :- motzkinTree(T, L, 0) .
```

```
motzkinTree(u) --> down.  
motzkinTree(l(A)) --> down,  
    motzkinTree(A).  
motzkinTree(a(A, B)) --> down,  
    motzkinTree(A),  
    motzkinTree(B).
```

# Generating closed de Bruijn terms

- we can derive a generator for closed lambda terms in de Bruijn form by extending the Motzkin-tree generator to keep track of the lambda binders
- when reaching a leaf  $v/1$ , one of the available binders (expressed as a de Bruijn index) will be assigned to it nondeterministically

```
genDB(v(X),V) -->
  {down(V,V0),
   between(0,V0,X)}. % we pick one of the binders here
genDB(l(A),V) --> down,
  {up(V,NewV)},
  genDB(A,NewV).
genDB(a(A,B),V) --> down,
  genDB(A,V),
  genDB(B,V).
```

# Generating closed de Bruijn terms – continued

```
genDB(L,T) :- genDB(T, 0, L, 0) . % terms of size L  
genDBs(L,T) :- genDB(T, 0, L, _) . % terms of size up to L
```

generation of terms with 3 internal nodes.

```
?- genDB(3,T).  
T = l(l(l(v(0)))) ;  
T = l(l(l(v(1)))) ;  
T = l(l(l(v(2)))) ;  
T = l(l(a(v(0), v(0)))) ;  
T = l(l(a(v(0), v(1)))) ;  
T = l(l(a(v(1), v(0)))) ;  
T = l(l(a(v(1), v(1)))) ;  
T = l(a(v(0), l(v(0)))) ;  
T = l(a(v(0), l(v(1)))) ;  
T = l(a(v(0), a(v(0), v(0)))) ;  
T = l(a(l(v(0)), v(0))) ;  
T = l(a(l(v(1)), v(0))) ;  
T = l(a(a(v(0), v(0)), v(0))) ;  
T = a(l(v(0)), l(v(0))) .
```

# Generators for compressed de Bruijn and standard terms

- we compose generators with transformers between representations
- we use DCGs to compose binary relations

## de Bruijn terms

```
genCompressed --> genDB,b2c.    % of size L  
genCompresseds --> genDBs,b2c. % up to size L
```

## standard terms

```
genStandard --> genDB,b2l.    % of size L  
genStandards --> genDBs,b2l. % up to size L
```

```
?- genCompressed(2,T).  
T = v(2, 0) ;  
T = v(2, 1) ;  
T = a(1, v(0, 0), v(0, 0)).  
?- genStandard(2,T).  
T = l(_G3434, l(_G3440, _G3440)) ;  
T = l(_G3434, l(_G3440, _G3434)) ;  
T = l(_G3437, a(_G3437, _G3437)).
```

# Generating closed typable terms

- again, we compose generators with transformers between isomorphic representations

```
genTypable(L, T) :- genCompressed(L, T), typable(T) .  
genTypables(L, T) :- genCompresseds(L, T), typable(T) .
```

```
?- genCompressed(2, T) .  
T = v(2, 0) ;  
T = v(2, 1) ;  
T = a(1, v(0, 0), v(0, 0)) .
```

# Generation of linear lambda terms

*Linear lambda terms* restrict binders to *exactly one* occurrence.

- The predicate `linLamb / 4` uses logic variables both as leaves and as lambda binders and generates terms in standard form
- binders accumulated on the way down from the root, must be split between the two branches of an application node

```
linLamb(X, [X]) -->[] .  
linLamb(l(X,A), Vs) -->down,  
    linLamb(A, [X|Vs]) .  
linLamb(a(A,B), Vs) -->down,  
    {subset_and_complement_of(Vs, As, Bs) }, % splits Vs, ensures linearity  
    linLamb(A, As),  
    linLamb(B, Bs) .
```

# Ensuring linearity

At each step of `subset_and_complement_of/3`,  
`place_element/5` is called to distribute each element of a set to exactly  
one of two disjoint subsets.

```
subset_and_complement_of([],[],[]).  
subset_and_complement_of([X|Xs],NewYs,NewZs) :-  
    subset_and_complement_of(Xs,Ys,Zs),  
    place_element(X,Ys,Zs,NewYs,NewZs).
```

```
place_element(X,Ys,Zs,[X|Ys],Zs).  
place_element(X,Ys,Zs,Ys,[X|Zs]).
```

interface generating linear compressed de Bruijn terms:

```
linLamb(L,CT) :- linLamb(T,[],L,0), l2c(T,CT).
```

# Generating linear affine lambda terms

- Linear affine lambda terms restrict binders to *at most one* occurrence.
- code is similar to the generator for linear terms linLamb – see paper

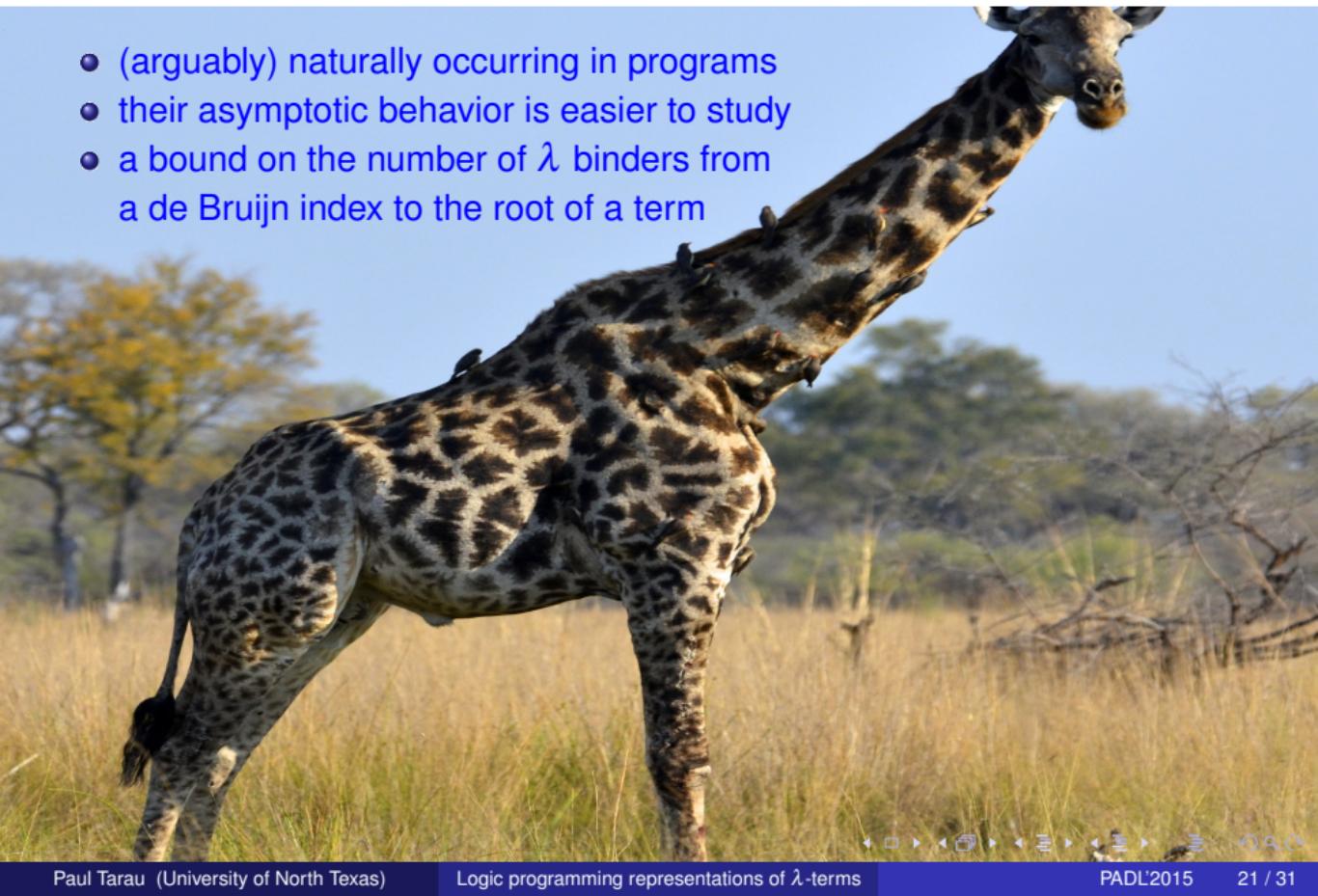
Lambda terms for L=3.

```
?- linLamb(3,T).  
T = a(2, v(0, 1), v(0, 0)) ;  
T = a(2, v(0, 0), v(0, 1)) ;  
T = a(1, v(0, 0), v(1, 0)) ;  
T = a(1, v(1, 0), v(0, 0)) ;  
T = a(0, v(1, 0), v(1, 0)) .
```

```
?- afLinLamb(3,T).  
T = v(3, 0) ; % 3 lambdas, 1 de Bruijn index  
T = a(2, v(0, 1), v(0, 0)) ; % these are the same  
T = a(2, v(0, 0), v(0, 1)) ;  
T = a(1, v(0, 0), v(1, 0)) ;  
T = a(1, v(1, 0), v(0, 0)) ;  
T = a(0, v(1, 0), v(1, 0)) .
```

# Lambda terms of bounded unary height

- (arguably) naturally occurring in programs
- their asymptotic behavior is easier to study
- a bound on the number of  $\lambda$  binders from a de Bruijn index to the root of a term



# Generating lambda terms of bounded unary height

- lambdas decrease the available depth parameter (D1 to D2)
- recursion is controlled both by size (DCGs do it implicitly) and by depth (via the parameter D)

```
boundedUnary(v(X), V, _D) --> {down(V, V0), between(0, V0, X)} .
```

```
boundedUnary(l(A), V, D1) --> down,
```

```
    {down(D1, D2), up(V, NewV)} ,
```

```
    boundedUnary(A, NewV, D2) .
```

```
boundedUnary(a(A, B), V, D) --> down,
```

```
    boundedUnary(A, V, D), boundedUnary(B, V, D) .
```

two interfaces:

```
boundedUnary(D, L, T) :- boundedUnary(B, 0, D, L, 0), b2c(B, T) . % of size L
```

```
boundedUnarys(D, L, T) :- boundedUnary(B, 0, D, L, _), b2c(B, T) . % up to size L
```

# Generating terms of the binary lambda calculus

- the predicate `blc(L, T, Cs)` generates the binary (0,1-list) `Cs` of length `L` representing the de Bruijn term `T`

```
blc(L,T,Cs) :- length(Cs,L), blc(B,0,Cs,[]), b2c(B,T).
```

```
blc(v(X),V) --> {between(1,V,X)}, encvar(X).
```

```
blc(l(A),V) --> [0,0], {up(V,NewV)}, blc(A,NewV).
```

```
blc(a(A,B),V) --> [0,1], blc(A,V), blc(B,V).
```

- de Bruijn binders are encoded as 00, applications as 01 and de Bruijn indices in unary notation are encoded as 00...01.
- the predicate `encvar/3`, uses `down/2` at each step to generate the sequence of 1 terminated 0 digits

```
encvar(0) --> [0].
```

```
encvar(N) --> {down(N,N1)}, [1], encvar(N1)
```

# Generating normal forms

- normal forms are lambda terms that cannot be further reduced
- a normal form should not be an application with a lambda as its left branch and, recursively, its subterms should also be normal forms
- the predicate `nf/4` defines this inductively and generates all normal forms with  $\perp$  internal nodes in de Bruijn form

```
nf(v(X),V) -->{down(V,V0),between(0,V0,X)}.
```

```
nf(l(A),V) -->down,
```

```
{up(V,NewV)},
```

```
nf(A,NewV).
```

```
nf(a(v(X),B),V) -->down,
```

```
nf(v(X),V),
```

```
nf(B,V).
```

```
nf(a(a(X,Y),B),V) -->down,
```

```
nf(a(X,Y),V),
```

```
nf(B,V).
```

# Generating compressed de Bruijn normal forms

Two interfaces:

```
nf(L,T) :- nf(B,0,L,0), b2c(B,T). % size exactly L
```

```
nfs(L,T) :- nf(B,0,L,_), b2c(B,T). % size up to L
```

```
?- nf(3,T).  
T = v(3, 0) ;  
T = v(3, 1) ;  
T = v(3, 2) ;  
T = a(2, v(0, 0), v(0, 0)) ;  
T = a(2, v(0, 0), v(0, 1)) ;  
T = a(2, v(0, 1), v(0, 0)) ;  
T = a(2, v(0, 1), v(0, 1)) ;  
T = a(1, v(0, 0), v(1, 0)) ;  
T = a(1, v(0, 0), v(1, 1)) ;  
T = a(1, v(0, 0), a(0, v(0, 0), v(0, 0))) ;  
T = a(1, a(0, v(0, 0), v(0, 0)), v(0, 0)) ;  
false.
```

# Normalization: $\beta$ -reduction

- the predicate `subst / 4` counts, starting from 0 the lambda binders down to an occurrence  $v(N)$ . Replacement occurs at level  $I=N$

```
beta(l(A),B,R) :- subst(A,0,B,R).
```

```
subst(a(A1,A2),I,B,a(R1,R2)) :- I>=0,  
    subst(A1,I,B,R1),  
    subst(A2,I,B,R2).
```

```
subst(l(A),I,B,l(R)) :- I>=0, I1 is I+1, subst(A,I1,B,R).
```

```
subst(v(N),I,_B,v(N1)) :- I>=0, N>I, N1 is N-1.
```

```
subst(v(N),I,_B,v(N)) :- I>=0, N<I.
```

```
subst(v(N),I,B,R) :- I>=0, N:=I, shift_var(I,0,B,R).
```

- when the right occurrence  $v(N)$  is reached, the term substituted for it is shifted such that its variables are marked with the new, incremented distance to their binders
- code for `shift_var` – in the paper

# The normalization algorithm

- not all derivations terminate - the calculus is only weakly normalizing!
- focus on leftmost outermost term - handled by `wh_nf` that reduces to *weak head normal form* – code in the paper

```
to_nf(v(X), v(X)) .  
to_nf(l(E), l(NE)) :- to_nf(E, NE) .  
to_nf(a(E1, E2), R) :- wh_nf(E1, NE), to_nf1(NE, E2, R) .
```

- case analysis of application terms for possible  $\beta$ -reduction is performed by `to_nf1/3`
- the second clause calls `beta/3` and recurses on its result

```
to_nf1(v(E1), E2, a(v(E1), NE2)) :- to_nf(E2, NE2) .  
to_nf1(l(E), E2, R) :- beta(l(E), E2, NewE), to_nf(NewE, R) . % reduction step  
to_nf1(a(A, B), E2, a(NE1, NE2)) :- to_nf(a(A, B), NE1), to_nf(E2, NE2) .
```

# Extending the evaluator to standard and compressed $\lambda$ -terms

- DCGs used for function composition “borrowing” normalization from de Bruijn terms

```
evalStandard :->l2b,to_nf,b2l.  
evalCompressed :->c2b,to_nf,b2c.
```

- evaluation of the lambda term  $SKK = ((\lambda x_0. \lambda x_1. \lambda x_2. ((x_0 x_2) (x_1 x_2)) \lambda x_3. \lambda x_4. x_3) \lambda x_5. \lambda x_6. x_5)$  in compressed de Bruijn form
- reduction to the definition of the identity combinator  $I = \lambda x_0. x_0$

```
?- S=a(3,a(0,v(0,2),v(0,0)),a(0,v(0,1),v(0,0))),K=v(2,1),  
    evalCompressed(a(0,a(0,S,K),K),R).  
S = a(3, a(0, v(0, 2), v(0, 0)), a(0, v(0, 1), v(0, 0))),  
K = v(2, 1),  
R = v(1, 0).
```

# Matching the integer sequences in Sloane's OEIS

- a simple sanity check
- two definitions of term size can be used
  - leaves can be of size 0 or size 1
  - the two options lead to different sequences
- A003095 counts binary trees, by depth
- A000108 counts binary trees, by size
- A001006 and A006318 count Motzkin-trees, by size
- A220894 and A135501 count closed de Bruijn terms by number of internal nodes
- A220471 counts closed typable terms, by size
- A224345 counts closed normal forms, by size
- A114852: counts terms of binary lambda calculus, by size

# Conclusion

Prolog code at:

<http://www.cse.unt.edu/~tarau/research/2015/dbx.pro>

We have (re)visited the use of logic programming as a meta-language for lambda terms and types - with focus on generation and type inference.

Compactness and simplicity of the code is coming from a combination of:

- logic variables / unification with occurs check / acyclic term testing
- Prolog's backtracking – and occasional CUTs :-)
- DCGs for implicit depth or size testing in generators
- DCGs for function and relation composition

The same is doable in functional programming - but with a much richer “language ontology” needed for managing state, backtracking, unification.

## Future work – from the close enough past :–)

Ongoing work on extending the playground:

- PPDP'15: a uniform representation of combinators, arithmetic, lambda terms, ranking/unranking to tree-based numbering systems
- CICM/Calculemus'15: size-proportionate Gödel numberings, random generation
- ICLP'15: type-directed generation of lambda terms

Playing with the playground - a Minecraft-like experience :–)