

# Proving tree algorithms for succinct data structures

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<https://github.com/affeldt-aist/succinct>

# Succinct Data Structures

## Introduction

Rank&Select  
Plan  
Definitions

## LOUDS

Implementation  
First attempt  
Second try

## Structural traversal

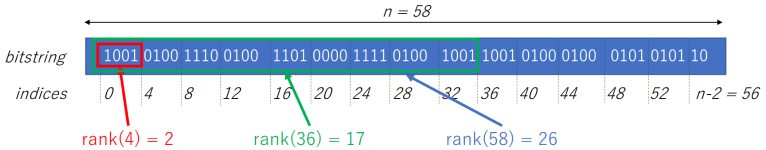
## Conclusion

- Representation optimized for both time and space
- *“Compression without need to decompress”*
- Much used for Big Data
- Application examples
  - Compression for Data Mining
  - Google’s Japanese IME

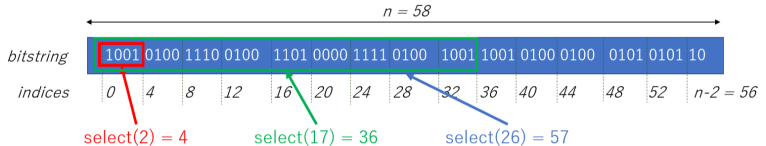
# Rank and Select

To allow fast access, two primitive functions are heavily optimized. They can be computed in constant time.

- $\text{rank}(i)$  = number of 1's up to position  $i$



- $\text{select}(i)$  = position of the  $i^{\text{th}}$  1:  $\text{rank}(\text{select}(i)) = i$



Proved implementation in [Tanaka A., Affeldt, Garrigue 2016]

## Trees in Succinct Data Structures

Featuring two views

**As data** Efficient encoding of trees using rank and select  
(this talk)

**As tool** Implementation of dynamic succinct data structures  
using red-black trees (next talk)

- Both are proved in Coq/SSREFLECT
- They can be combined together

## Basic Coq definitions

`rank` is easily defined. `select` is its (minimal) inverse.

**Variables**  $(T : \text{eqType}) (b : T) (n : \text{nat}).$

**Definition** `rank`  $i \ s := \text{count\_mem } b \ (\text{take } i \ s).$

**Definition** `Rank`  $(i : \text{nat}) (B : n.\text{-tuple } T) :=$   
 $\#|[\text{set } k : [1, n] \mid (k \leq i) \ \&\& \ (\text{tacc } B \ k == b)]|.$

**Lemma** `select_spec`  $(i : \text{nat}) (B : n.\text{-tuple } T) :$   
 $\text{exists } k, ((k \leq n) \ \&\& \ (\text{Rank } b \ k \ B == i)) \ ||$   
 $(k == n.+1) \ \&\& \ (\text{count\_mem } b \ B < i).$

**Definition** `Select`  $i (B : n.\text{-tuple } T) :=$   
 $\text{ex\_minn } (\text{select\_spec } i \ B).$

`pred`  $s \ y =$  last  $b$  up to  $y$ . `succ`  $s \ y =$  first  $b$  from  $y$  on.

**Definition** `pred`  $s \ y := \text{select } (\text{rank } y \ s) \ s.$

**Definition** `succ`  $s \ y := \text{select } (\text{rank } y.\text{-1 } s).+1 \ s.$

Getting the indexing right is a nightmare.

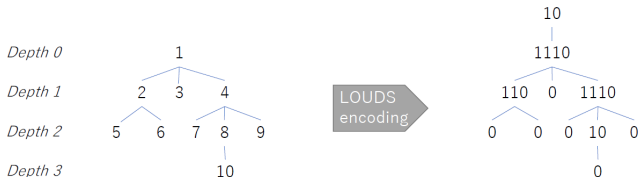
Here **indices start from 1**, but there is no fixed convention.

## LOUDS

# L.O.U.D.S.

## Level-Order Unary Degree Sequence

[Navarro 2016, Chapter 8]



Depth 0	Depth 1	Depth 2	Depth 3
1	234	56789	10

Depth 0	Depth 1	Depth 2	Depth 3
10	1110	11001110	000100

- Unary coding of node arities, put in breadth-first order
- Each node is arity 1's followed by a 0
- The structure of a tree uses just  $2n + 2$  bits
- Useful for dictionaries (Google Japanese IME)

## Implementation of primitives

We define an isomorphism between valid **paths** in the tree, and valid **positions** in the LOUDS.

The basic operations are

- Position of the root (2 with virtual root, **counting from 0**)
- Position of the  $i^{th}$  child of a node
- Position of its parent
- Number of children

**Variable** B : seq bool.

**Definition** LOUDS\_child v i :=

select false (rank true (v + i) B).+1 B.

**Definition** LOUDS\_parent v :=

pred false B (select true (rank false v B) B).

**Definition** LOUDS\_children v :=

succ false B v.+1 - v.+1.

## First attempt

`count_smaller t p` = number of nodes appearing before the path `p` in breadth first order.

**Definition** `LOUDS_position (t : tree) (p : seq nat) :=`  
`(count_smaller t p + (count_smaller t (rcons p 0)).-1).+2.`  
(\*    number of 0's                      number of 1's                      virtual root \*)

**Definition** `LOUDS_subtree B (p : seq nat) :=`  
`foldl (LOUDS_child B) 2 p.`

**Theorem** `LOUDS_positionE t (p : seq nat) :`  
let B := LOUDS t in valid\_position t p ->  
`LOUDS_position t p = LOUDS_subtree B p.`

**Theorem** `LOUDS_parentE t (p : seq nat) x :`  
let B := LOUDS t in valid\_position t (rcons p x) ->  
`LOUDS_parent B (LOUDS_position t (rcons p x)) = LOUDS_position t p.`

**Theorem** `LOUDS_childrenE t (p : seq nat) :`  
let B := LOUDS t in valid\_position t p ->  
`children t p = LOUDS_children B (LOUDS_position t p).`



## Various problems

- Breadth first traversal does not follow the tree structure
- Cannot use structural induction
- No **natural correspondence** to use in proofs
- Oh, the indices!

## As a result

- LOUDS related proofs take more than 800 lines
- Many lemmas have proofs longer than 50 line
- The should be a better approach...

## Second try

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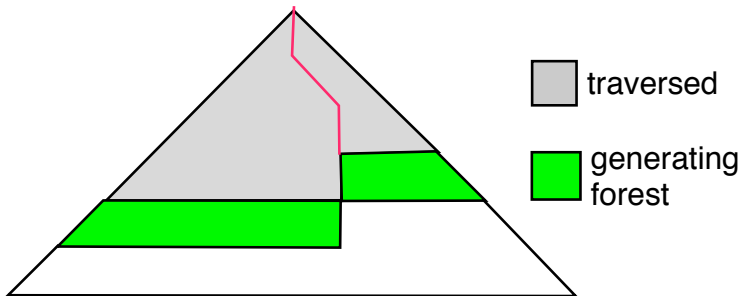
### LOUDS

Implementation  
First attempt  
Second try

### Structural traversal

### Conclusion

- Introduce **traversal up to a path**
- For easy induction, work on forests rather than trees
- A generating forest need not be on the same level!



# Traversal and Remainder

Introduction

Rank&Select

Plan

Definitions

LOUDS

Implementation

First attempt

Second try

Structural  
traversal

Conclusion

**Variable** (A B : Type) (f : tree A -> B).

(\* Traversal of nodes before path p \*)

**Fixpoint** lo\_traversal\_lt (w : forest A) (p : seq nat) : seq B.

(\* Generating forest for nodes following path p \*)

**Fixpoint** lo\_traversal\_res (w : forest A) (p : seq nat) : forest A.

(\* Relation between them \*)

**Lemma** lo\_traversal\_lt\_cat w p1 p2 :

lo\_traversal\_lt w (p1 ++ p2) =

lo\_traversal\_lt w p1 ++ lo\_traversal\_lt (lo\_traversal\_res w p1) p2.

(\* Complete traversals are all equal \*)

**Theorem** lo\_traversal\_lt\_max t p :

size p >= height t ->

lo\_traversal\_lt [:: t] p = lo\_traversal\_lt [:: t] (nseq (height t) 0).

All paths lead to Rome !

# Indices and Positions in LOUDS

## LOUDS

(\* LOUDS\_lt is a path-indexed traversal \*)

**Definition** LOUDS\_lt w p := flatten  
(lo\_traversal\_lt (node\_description \o children\_of\_node) w p).

(\* This corresponds to the standard definition of LOUDS \*)

**Theorem** LOUDS\_lt\_ok (t : tree A) p :  
size p >= height t -> LOUDS t = true :: false :: LOUDS\_lt [:: t] p.

(\* Position of a node in the LOUDS \*)

**Definition** LOUDS\_position w p := size (LOUDS\_lt w p).

(\* Index of a node in level-order \*)

**Definition** LOUDS\_index w p := size (lo\_traversal\_lt id w p).

**Lemma** LOUDS\_position\_select w p p' :  
valid\_position (head dummy w) p ->  
LOUDS\_position w p =  
select false (LOUDS\_index w p) (LOUDS\_lt w (p ++ p')).

**Lemma** LOUDS\_index\_rank w p p' n :  
valid\_position (head dummy w) (rcons p n) ->  
LOUDS\_index w (rcons p n) =  
size w + rank true (LOUDS\_position w p + n) (LOUDS\_lt w (p ++ n :: p')).

## Properties proved

Introduction

Rank&Select

Plan

Definitions

LOUDS

Implementation

First attempt

Second try

Structural

traversal

Conclusion

**Theorem** LOUDS\_childE (t : tree A) (p p' : seq nat) x :  
`let B := LOUDS_lt [:: t] (rcons p x ++ p') in`  
`valid_position t (rcons p x) ->`  
`LOUDS_child B (LOUDS_position [:: t] p) x =`  
`LOUDS_position [:: t] (rcons p x).`

**Theorem** LOUDS\_parentE (t : tree A) p p' x :  
`let B := LOUDS_lt [:: t] (rcons p x ++ p') in`  
`valid_position t (rcons p x) ->`  
`LOUDS_parent B (LOUDS_position [:: t] (rcons p x)) =`  
`LOUDS_position [:: t] p.`

**Theorem** LOUDS\_childrenE (t : tree A) (p p' : seq nat) :  
`let B := LOUDS_lt [:: t] (rcons p 0 ++ p') in`  
`valid_position t p ->`  
`children t p = LOUDS_children B (LOUDS_position [:: t] p).`

## Bonus: A Structural Traversal

Breadth-first traversal uses induction on the height:

```
Variable f : tree A -> B.  
Fixpoint lo_traversal'' n (l : forest A) :=  
  if n is n'.+1 then  
    map f l ++ lo_traversal'' f n' (children_of_forest l)  
  else [::].  
Definition lo_traversal t := lo_traversal'' (height t) [:: t].
```

We can avoid that by doing the traversal in 2 steps;  
1st, build a list of levels, and then catenate them.

```
Fixpoint level_traversal t :=  
  let: Node a cl := t in  
  [:: f t] :: foldr (fun t1 => merge1 (level_traversal t1)) nil cl.  
  
Fixpoint level_traversal_cat (t : tree A) ss {struct t} :=  
  let: (s, ss) :=  
    if ss is s :: ss then (s, ss) else (nil, nil) in  
  let: Node a cl := t in  
  (f t :: s) :: foldr level_traversal_cat ss cl.  
Definition lo_traversal_cat t := flatten (level_traversal_cat t nil).
```

level\_traversal is structural, but its complexity is bad.

## Advantages of the new approach

- All proofs are by induction on paths
- Common lemmas arise naturally
- Down to about 500 lines in total, long proofs about 25

## Remaining problems

- There are still long lemmas (`lo_traversal_lt_max`, ...)
- Paths all over the place

## Future work

- Can we apply that to other breadth-first traversals

## Proofs

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