# Zip-zip Trees: Making Zip Trees More Balanced, Biased, Compact, or Persistent

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## Motivation

## 2 Skip Lists

- 3 Zip Trees
- Uniform Zip Trees
- 5 Zip-zip Trees
- 6 Experimental Results
- 7 Summary

- Uses of Binary Search Trees (BSTs)?
  - Priority queues, lookup tables, link-cut, dynamic sets, ...
- Why?
  - Insert :  $\mathcal{O}(\log n)\mathcal{O}(h)$
  - Delete:  $\mathcal{O}(\log n)\mathcal{O}(\frac{h}{h})$
  - Search:  $\mathcal{O}(\log n)\mathcal{O}(h)$
  - Space :  $\mathcal{O}(n)$
- How to balance efficiently?
- How much is balancing going to cost?

## History

- circa 1960 BSTs discovered [2]
- 1962 AVL tree [1] complicated
  - 1.44 log *n* height worst case
  - Time cost: amortized constant per insertion
  - Space cost: 2 bits per node  $\mathcal{O}(1)$
- 1989 Treap [3] space inefficient
  - 1.39 log *n* expected average depth w.h.p.
  - Time cost: expected constant w.h.p.
  - Space cost:  $O(\log n)$  bits per node
- 2018 Zip tree [4] unbalanced
  - 1.5 log *n* expected average depth w.h.p.
  - Time cost: expected constant w.h.p.
  - Space cost: log log n bits per node

# Our BST

### • 2018 – Zip tree [4] - unbalanced

- 1.5 log *n* expected average depth
- Time cost: expected constant w.h.p.
- Space cost: log log n bits per node
- We would like:
  - $\Box$  Lower expected average depth 1.39 log *n*
  - □ Same, low time cost
  - □ At least as good space cost either  $\log \log n$  or O(1) w.h.p.
  - □ Maintain history independence? may be strongly history independent
  - Persistent? partially persistent
  - Biased? keys can be biased in a natural way

#### • 2023 - Zip-zip trees

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# Skip List

- Sorted vector: Insert / Delete  $\mathcal{O}(n)$ , Find  $\mathcal{O}(\log n)$
- Sorted linked-list: Find:  $\mathcal{O}(n)$ , Insert / Delete  $\mathcal{O}(1)$  after find
- What if you add 'fast lanes'?
- Idea: 1 move in level  $k \approx 2$  in level  $k 1 \approx 2^k$  in level 0
- \$\mathcal{O}\$(log n) expected search time



# Skip List Height

#### Theorem

The height of a skip list is less than  $\log n + f(n) w/$  probability  $1 - 2^{-f(n)}$ 

### Proof.

• Each node has height of geometric random variable w/ p = 1/2,  $X_i$ 

• 
$$\Pr(X_i > \log n + f(n)) < 2^{-(\log n + f(n))} = 2^{-f(n)}/n$$

• Let 
$$X = \max\{X_1, X_2, ..., X_n\}$$

• By union bound,  $\Pr(X > \log n + f(n)) < 2^{-f(n)}$ 



# Skip List Size

#### Theorem

The size of a skip list is expected to be 2n

### Proof.

• 
$$\mathbb{E}(X_i) = \sum_{k=1}^{\infty} k \times 2^{-k} = 2$$

• From linearity of expectations,  $\mathbb{E}(\sum_{i} X_{i}) = 2n$ 

### • This is not good!



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## Zip Tree

• Idea: Construct a BST from a skip-list - flat-out better!



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## Zip Tree Structure I

- What is the structure?
- It's a BST, so x.left.key < x.key < x.right.key
- Each node has a geometrically distributed 'rank'
- x.rank > x.left.rank, x.rank ≥ x.right.rank
- Not symmetric!



# Zip Tree Structure II

#### Lemma

If root has rank k, then the expected depth of the max key is at most k

### Proof.

- Nodes on path above minimum value have increasing rank
- Difference between them is geometrically distributed
- Average increase is 1, length is expected k/1 = k if max has rank  $0 \square$



# Zip Tree Structure III

#### Lemma

If root has rank k, then the expected depth of the min key is at most k/2

### Proof.

- Nodes on path above minimum value have strictly increasing rank
- Difference between them is geometrically distributed
- Average increase is 2, length is expected k/2 if min has rank 0



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# Zip Tree Structure IIII

- Recall:
  - Max key expected depth k
  - Min key expected depth  $k/2^1$

### • Asymmetric!

• Recall: Height of skip list is  $< \log n + f(n) w/$  probability  $1 - 2^{-f(n)}$ 

### Theorem

The average depth of a node in a zip tree is 1.5 log n

## Proof.

- Average rank of the root is  $\log n + O(1)$
- Average rank of arbitrary node is 1 o Average k is log n + O(1)
- Arbitrary node expected depth  $= k + k/2 = 1.5 \log n$

<sup>1</sup>Let k be the rank difference to root

## Zip Tree Problem

- Zip tree expected depth: 1.5 log n
- Treap expected depth: 1.39 log n
- What is a treap?
  - Uniformly distributed ranks
  - If collision, rebuild  $\rightarrow$  no collisions!
- Why difference? Collisions  $\rightarrow$  Unbalance



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## Uniform Zip Trees

- $\bullet$  Problem with zip tree? Collisions  $\rightarrow$  Unbalance
- What if few collisions?
- Idea:
  - Pick ranks from large enough range uniformly,  $[1, n^c]$
  - When collision, break ties like zip tree
- This works but...
- Metadata space is  $c \log n$
- We want (at least)  $O(\log \log n)!$

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- What if rank was a tuple,  $(r_1, r_2)$ ?
  - Let r<sub>1</sub> be geometrically distributed
  - Let  $r_2$  be uniformly distributed from  $[1, \log^c n]$
- Compare ranks lexicographically
- $\Box \text{ Metadata size } O(\log \log n)? O(\log \log n) + O(c \log \log n)$
- Hope: fewer collisions, better depth?

## Zip-zip Trees Example



## Zip-zip Trees Analysis I



# Zip-zip Trees Analysis II

• How big are rank groups?

#### Lemma

The size of an  $r_1$  rank group has expected value 2 and is  $< 2 \log n w.h.p.$ 

#### Proof.

• Size is (at most) geometrically distributed



# Zip-zip Trees Analysis III

#### Theorem

The expected depth,  $\delta_j$ , of the j-th smallest key in a zip-zip tree is  $H_j + H_{n-j+1} - 1 + o(1)$ 

#### Proof.

- Rank of the root < 3 log n w.h.p
- Probability there are  $r_2$  rank collisions is negligible w.h.p.
- Bound follows assuming low-ranked root & no collisions

### Corollary

The expected depth of the min and max keys is  $0.69 \log n + \gamma + o(1)$ 

## Corollary

The expected depth of any key is at most  $1.39 \log n - 1 + o(1)$ 

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# Just-in-Time (JIT) Zip-zip Trees

- Ranks can be up to O(log n), but don't differ much
  - Store  $r_1$  rank differences! (Expected O(1))
- Rank groups are small...
  - Generate  $r_2$  ranks on the fly! (Expected  $O(1))^2$



 $^{2}r_{1}$  differences are O(1) per node,  $r_{2}$  are O(1) per operation

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# Depth Discrepancy



Depth Discrepancy Comparison (LogLog), 10k+ simulations

Figure 4: The depth discrepancy between the min and max keys for three variants

## Average Key Depth and Tree Height

Average Depth and Height Comparison (LogLog), 10k+ simulations



Figure 5: The average node depth and tree height for three variants

## Rank Collisions



Figure 6: The frequency of encountered rank ties per rank comparison for the uniform variant and per element insertion for the zip-zip variant

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# Just-in-Time Zip-zip Tree Size





Figure 7: The metadata size for the just-in-time implementation

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### • 2023 - Zip-zip tree

 $\boxed{1.39 \log n}$  expected average depth

- Time cost: expected constant w.h.p.
- Space cost:  $\log \log n$  bits per node (or O(1) bits per update w.h.p.)

## Easy to implement

Strongly history independent (except JIT)

- May be partially persistent
- Supports biased keys (still  $O(\log \log n)$  bits per node)

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