

## SQRT List

Fast random access linked list with  
square root decomposition technique

# Index

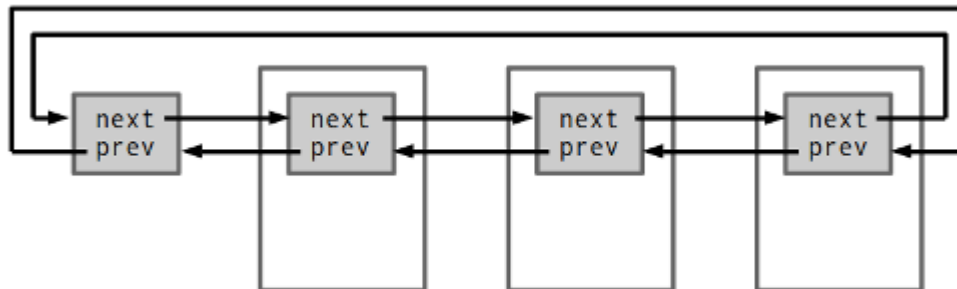
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- ❖ **Introduction**
- ❖ **Project Goal**
- ❖ **Implementation**
- ❖ **Performance Test**

# 1. Introduction

## ❖ Linked List

- It is widely used throughout the Linux kernel code
  - Process Management (`task_struct`)
  - File System (`super_block`, `inode`)
  - Networking (`tcp_sock`)
  - And many things...
- Its performance can highly affect the overall system performance



# 1. Introduction

## ❖ Array vs Linked List

- Use an array if **random access** occurs mostly
- Use a linked list if **insertion** and **deletion** occur mostly
- But when **random access**, **insertion**, and **deletion** all occur at a similar number of times, which data structure should we choose?

Operation	Array	Linked List
Sequential Access	$O(1)$	$O(1)$
Random Access	$O(1)$	$O(N)$
Insertion	$O(N)$	$O(1)$
Deletion	$O(N)$	$O(1)$

# 1. Introduction

## ❖ Array vs Linked List

- Use an array if **random access** occurs mostly
- Use a linked list if **insertion** and **deletion** occur mostly
- But when **random access**, **insertion**, and **deletion** all occur at a similar number of times, which data structure should we choose?

We need a data structure in which all operations operate at a **moderately high speed**.

## 2. Project Goal

- ❖ **Faster random access speed** of linked list

a.k.a. Read  $i$ th element of the list

Linked List:  $O(N)$

→ SQRT List:  $O(\sqrt{N})$

- ❖ **Keep sequential access speed as is**

Linked List:  $O(1)$

→ SQRT List:  $O(1)$

- ❖ **Sacrifice a little bit of insertion & deletion speed**

Linked List:  $O(1)$

→ SQRT List:  $O(\sqrt{N})$

## 2. Project Goal

### ❖ **Faster random access speed of linked list**

a.k.a. **Read  $i$ th element of the list**

Linked List:  $O(N)$

→ SQRT List:  $O(\sqrt{N})$

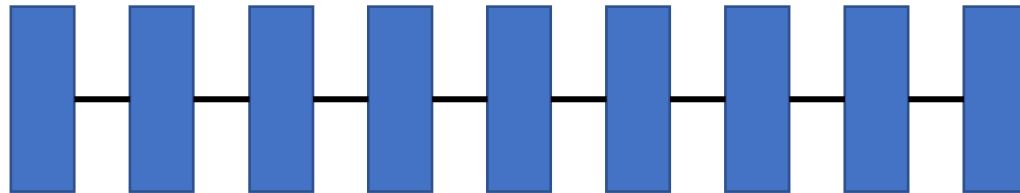
Our team solved this problem with  
**square root decomposition technique.**

So we named this new data structure **SQRT List.**

# 3. Implementation

## ❖ From the Linked List

- We need the concept of a multi-level list
- We will divide the elements into something called **buckets**
- We will use buckets to increase random access speed



Linked List ( $N=9$ )



# Square Root Decomposition

## ❖ Building Buckets

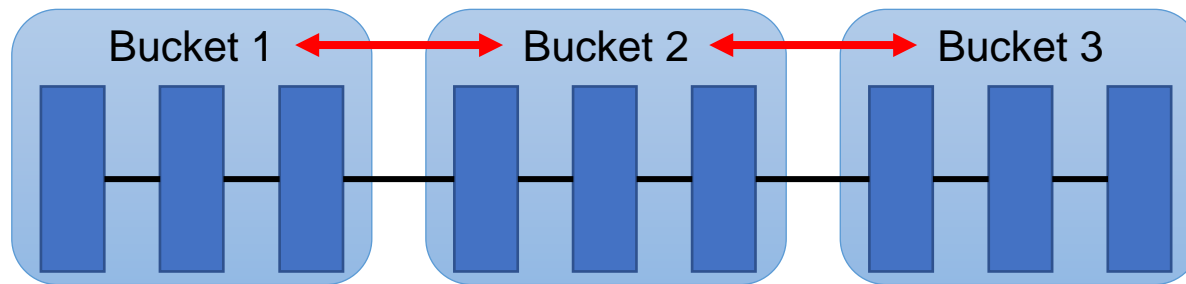
- Divide elements into buckets, in sequence → **Square Root Decomposition**

**Bucket Count** (the number of buckets):  $\sqrt{N}$  (a near integer)

**Bucket Size** (the number of elements in a bucket):  $N \div (\text{Bucket Count}) = \sqrt{N}$

The bucket count  $\sqrt{N}$  is **optimal** for random access

- Each bucket has a direct link to the prev & next bucket



SQRT List ( $N=9$ )

# $O(\sqrt{N})$ Random Access

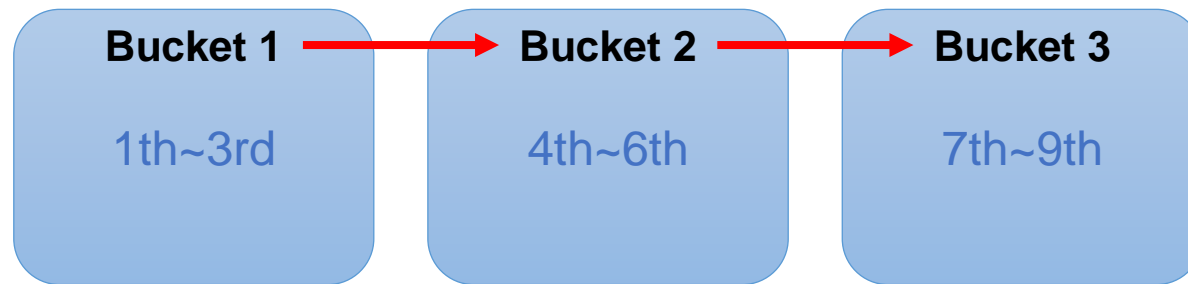
## ❖ How to find $i$ th element

- Step 1: Find the bucket

Find the bucket that contains  $i$ th element

There are only  $\sqrt{N}$  buckets to traverse

Time complexity:  $O(\sqrt{N})$



SQRT List ( $N=9$ )

# $O(\sqrt{N})$ Random Access

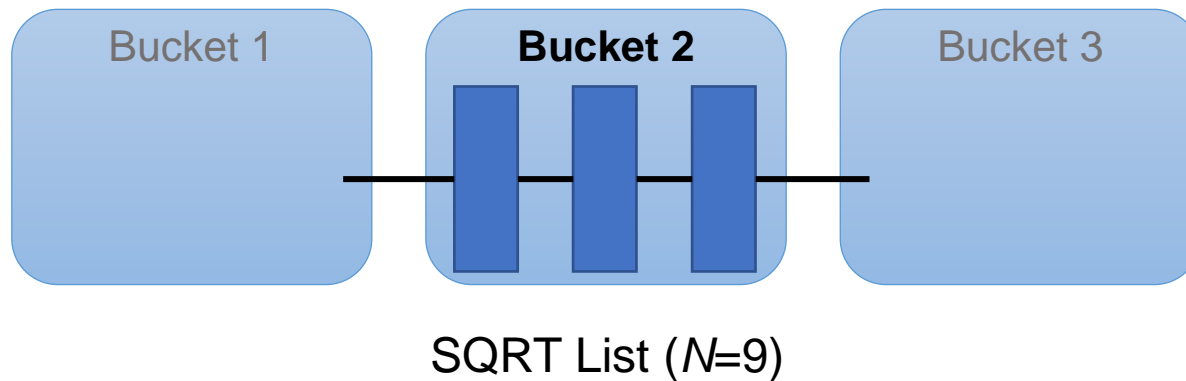
## ❖ How to find $i$ th element

- Step 2: Find the element

Find the element in the selected bucket

There are only  $\sqrt{N}$  elements to traverse in one bucket

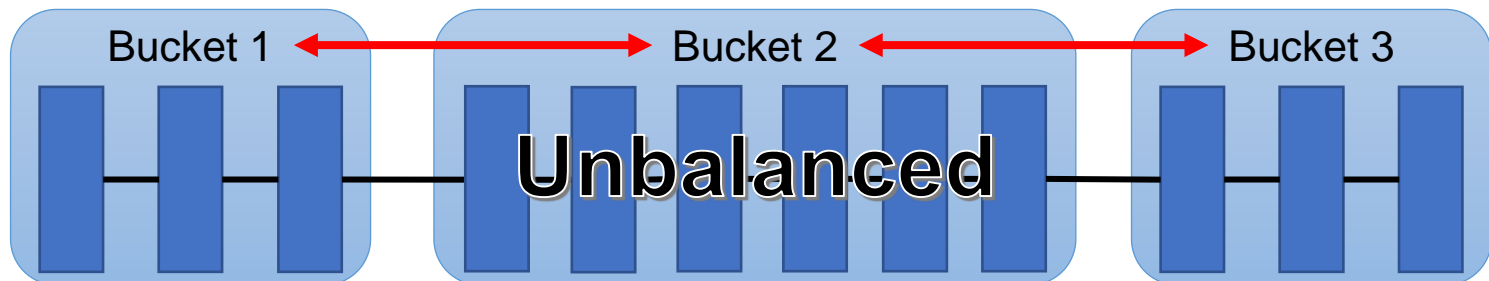
Time complexity:  $O(\sqrt{N})$



# Insertion

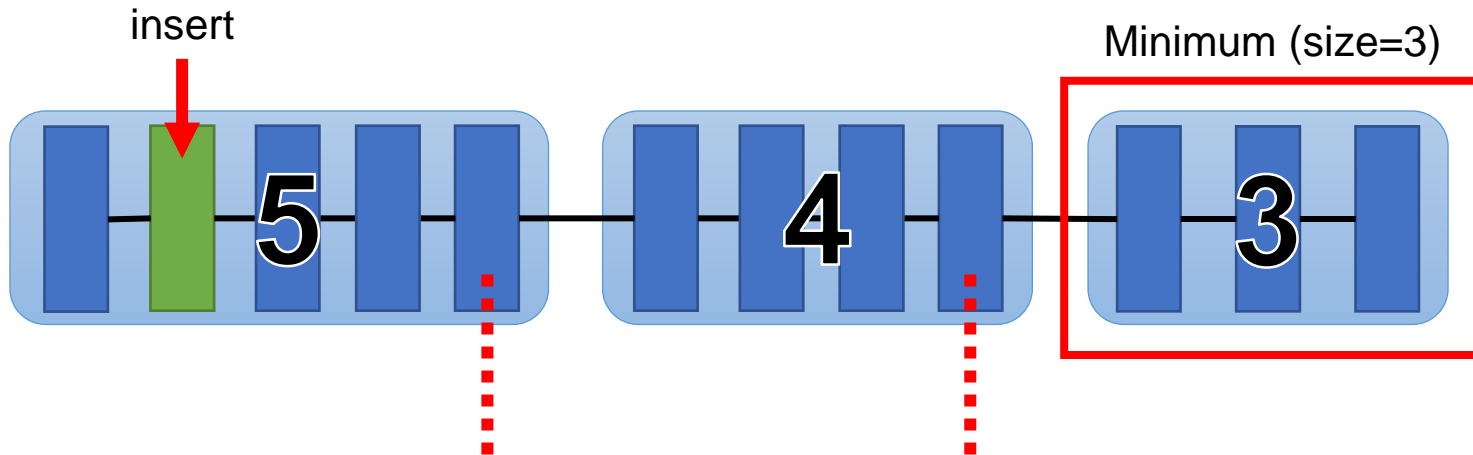
## ❖ Problem 1

- If we keep inserting elements into only one bucket, the size between buckets can become unbalanced
- Unbalanced buckets degrade random access performance
- We need a **self-balancing** bucket

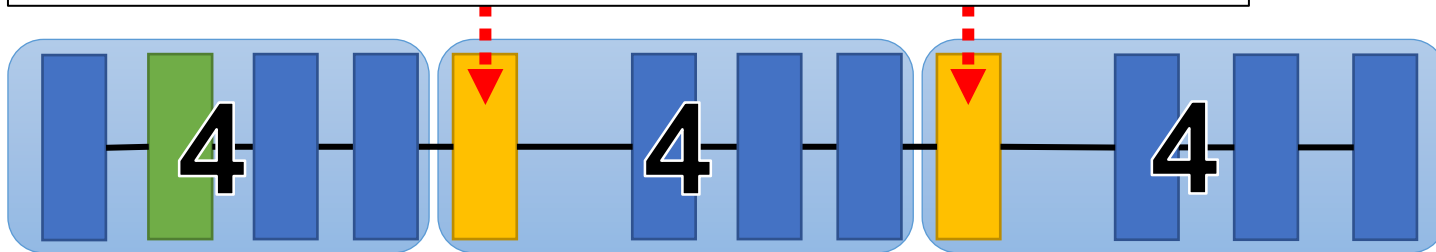


# $O(\sqrt{N})$ Self-Balancing Bucket

Step 1. Right after insertion, find minimum size bucket :  $O(\sqrt{N})$



Step 2. From the bucket of an inserted element to the minimum bucket, move one element of each bucket in the direction of minimum bucket :  $O(\sqrt{N})$



After that, The size between buckets can differ by **at most 1**, always! → **Balanced**

# Insertion

## ❖ Problem 2

- If we keep inserting elements, the size of a bucket is getting bigger
- Even if they are balanced, it degrades random access performance
- We need to add a **new** bucket to reduce the size of each bucket

## ❖ The simple solution: Rebuilding Buckets

- **Remove all old buckets and create new  $\sqrt{N}$  buckets from scratch**

Unfortunately, it costs  $O(N)$  to do that

- However, you don't need to rebuild buckets every time

Rebuild when the number of elements  $N$  becomes about **1, 4, 9, 16, 25...**

Because the integer value of  $\sqrt{N}$  is changed only at those moments

- So the **amortized time complexity** is low

$$O(N) \text{ cost, once per } \sqrt{N} \text{ times} = O\left(\frac{N}{\sqrt{N}}\right) = O(\sqrt{N})$$

Similar to the technique used in C++'s vector and Java's ArrayList

# Deletion

## ❖ Deletion is the inverse of insertion

- Deletion is almost the same as insertion, except that it is the inverse
- Self-Balancing Algorithm: Do it from the maximum size bucket to the bucket of a deleted element,  $O(\sqrt{N})$
- Rebuilding Algorithm: Only some conditions are slightly different,  $O(\sqrt{N})$

## ❖ Total Time Complexity

- **Random Access:** (Find the bucket) + (Find the element) =  $O(\sqrt{N})$
- **Insertion:** (Self-Balancing) + (Rebuilding) =  $O(\sqrt{N})$
- **Deletion:** (Self-Balancing) + (Rebuilding) =  $O(\sqrt{N})$

# 4. Performance Test

## ❖ Linux Data Structures

- XArray, List, **SQRT List**

## ❖ Operations

- Random Access (x20000) : Read ***i***th element  
*i*: random number between 1 and 20000
- Sequential Access (x20000) : Read the **next** element consecutively  
From 1st element to 20000th element
- Insert (x20000) : Insert an element at a **random** position  
An array must have consecutive indices from 0 to  $N-1$  after this operation
- Delete (x20000) : Delete a **random** element  
An array must have consecutive indices from 0 to  $N-1$  after this operation



# 4. Performance Test

## ❖ Result

- **Random Access:** Sqrt List is **57x faster** than List (17ms < 1014ms)
- **Total:** Sqrt List is **36x faster** than List (28ms < 1016ms)

```
[ 2602.245114] ===== Sqrt List Module Init =====
[ 2609.338761] xarray_test      (random access)      :      0.62 ms (20000 times)  O(1)
[ 2609.338783] xarray_test      (sequential access):      0.63 ms (20000 times)  O(1)
[ 2609.338784] xarray_test      (insert)              :    3531.08 ms (20000 times) O(N)
[ 2609.338784] xarray_test      (delete)             :    3558.24 ms (20000 times) O(N)
[ 2609.338784] xarray_test      (total)                :    7090.59 ms
[ 2611.187750] list_test        (random access)      :    1014.69 ms (20000 times)  O(N)
[ 2611.187751] list_test        (sequential access):      0.44 ms (20000 times)  O(1)
[ 2611.187752] list_test        (insert)              :      0.46 ms (20000 times)  O(1)
[ 2611.187752] list_test        (delete)             :      0.47 ms (20000 times)  O(1)
[ 2611.187752] list_test        (total)                :    1016.09 ms
[ 2611.236182] sqrt_list_test  (random access)      :      17.85 ms (20000 times) O(√N)
[ 2611.236184] sqrt_list_test  (sequential access):      0.49 ms (20000 times)  O(1)
[ 2611.236184] sqrt_list_test  (insert)              :      4.74 ms (20000 times) O(√N)
[ 2611.236184] sqrt_list_test  (delete)             :      5.15 ms (20000 times) O(√N)
[ 2611.236184] sqrt_list_test  (total)                :      28.24 ms
[ 2611.238229] ===== Sqrt List Module Exit =====
ubuntu@ubuntu:~/source/cau-linux/sqrt-list$
```

# Q&A

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