

Alexandria University Faculty of engineering

Computer and Systems Engineering Department CSE-224: Data Structures & Algorithms

Lab #4 Perfect Hashing



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Problem Statement

Universal Hashing

A probability distribution H over hash functions from U to $\{1, ..., M\}$ is universal if for all x = y in U, we have

$$Pr[h(x) = h(y)] \le 1/M$$

Theorem 1

If H is universal, then for any set $S \subset U$, for any $x \in U$ (that we might want to insert or lookup), for a random h taken from H, the expected number of collisions between x and other elements in S is at most N/M.

Constructing a Universal Hash Family: the Matrix Method

Let's say keys are u-bits long. Say the table size M is the power of 2, so an index is b-bits long with $M = 2^b$. What we'll do is pick h to be a random b-by-u 0/1 matrix, and define h(x) = hx, where we do addition mod 2. For instance:

$$\begin{array}{c|cccc}
h & x & h(x) \\
\hline
1 & 0 & 0 & 0 \\
0 & 1 & 1 & 1 \\
1 & 1 & 1 & 0
\end{array}$$

$$\begin{array}{c|cccc}
1 & 0 & 0 & 0 \\
0 & 1 & 1 & 1 \\
0 & 0 & 0
\end{array}$$

We can show that for x = y, $P r[h(x) = h(y)] = 1/M = 1/2^b$

O(N^2)-Space Solution

Say we are willing to have a table whose size is quadratic in the size N of our dictionary S. Then, here is an easy method. Let H be universal and $M = N^2$. Pick a random h from H and try it out, hashing everything in S. So, we just try it, and if we got any collisions, we just try a new h. On average, we will only need to do this twice.

O(N)-Space Solution

The main idea for this method is to use universal hash functions in a 2-level scheme.

The method is as follows. We will first hash into a table of size N using universal hashing. This will produce some collisions. However, we will then rehash each bin using Method 1, squaring the size of the bin to get zero collisions. So, the way to think of this scheme is that we have a first-level hash function h and first-level table A, and then N second-level hash functions h1, ..., hN and N second-level tables A1, ..., AN. To look-up an element x, we first compute i = h(x) and then find the element in Ai[hi(x)].

You're required to:

- 1. Implement an $O(N^2)$ as well as an O(N)-Space perfect hash table implemented as described.
- 2. Verify that the hash table you constructed consumes O(N²)-space in the quadratic space method and O(N)-space in the linear space method.
- 3. Report the number of times required to re-build the hash table in the case of collision.
- 4. Deliver a report describing your implementation details.

Implementation

O(N^2)-Space Hash Table

- The size of the hash table is read from the user.
- The size gets squared and the smallest number power of 2 that covers the desired dictionary size is found to represent the table size.
- The hash table is filled initially with Integer.MIN_VALUE, and it is assumed that it won't be inserted. The hashing function is represented by a matrix of 0s and 1s, and it is generated randomly using the setMatrix() method.
- On every collision, the rehash() method gets called and the hash function is changed, and the function loops through the table and hashes every entry using the new hash function.

O(N)-Space Hash Table

- The size of the hash table is read from the user.
- The smallest number power of 2 that covers the desired dictionary size is found to represent the table size (The Dictionary is represented as **Buckets**).
- The Buckets are initially constructed with zero size.
- Each Bucket has a list to maintain the elements, that are added to it, to be hashed at the end of insertions using $O(N^2)$ space hash table.
- The 1st—level hash function (h) is generated randomly using the setMatrix() method.
- On every collision at level 1, the elements are kept in that collided Bucket.
- At the end of the insertions, we check if (h) gives $\sum_i n_i^2 < 4n$; where: n is The memory needed for the 1st level table;
 - n_i are the elements that hashed to the Bucket i.
 - When the condition holds, we invoke the function hashBuckets() which loops through each non-empty Bucket and hash its elements using Method 1.
 - When it doesn't hold, we invoke the function rehash() which will choose a new hash function (h') & rebuilds the hash table from the beginning.

Test cases

$O(N^2)$ -Space Test cases

These tests Verify that the space required is $O(N^2)$ & show the collisions number.

```
Test 1 - O(N^2)-Space
                                                      Test 2 - O(N^2)-Space
                                              entered size 50
entered size 15
                                              built hashtable with size 4096
built hashtable with size 256
                                              the table is 1.6384 n^2
the table is 1.13777777777778 n^2
                                              inserting variable length samples 20 times
inserting variable length samples 20 times
                                              1- inserting 4 elements
1- inserting 3 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              2- inserting 6 elements
2- inserting 11 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
3- inserting 6 elements
                                              3- inserting 31 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
4- inserting 6 elements
                                              4- inserting 8 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              5- inserting 9 elements
5- inserting 11 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              6- inserting 31 elements
6- inserting 11 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              7- inserting 31 elements
7- inserting 2 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              8- inserting 37 elements
8- inserting 4 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              9- inserting 44 elements
9- inserting 6 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 1
                                              10- inserting 35 elements
10- inserting 1 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              11- inserting 38 elements
11- inserting 0 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              12- inserting 35 elements
12- inserting 8 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              13- inserting 32 elements
13- inserting 5 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              14- inserting 30 elements
14- inserting 4 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              15- inserting 33 elements
15- inserting 1 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
16- inserting 12 elements
                                              16- inserting 5 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              17- inserting 9 elements
17- inserting 3 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              18- inserting 41 elements
18- inserting 8 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              19- inserting 33 elements
19- inserting 9 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 0
                                              20- inserting 27 elements
20- inserting 14 elements
                                              number of rebuilds (collsions): 0
number of rebuilds (collsions): 4
```

Test $3 - O(N^2)$ -Space Test $4 - O(N^2)$ -Space entered size 100 entered size 150 built hashtable with size 16384 built hashtable with size 32768 the table is 1.6384 n^2 the table is 1.456355555555556 n^2 inserting variable length samples 20 times inserting variable length samples 20 times 1- inserting 97 elements 1- inserting 63 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 2- inserting 94 elements 2- inserting 38 elements number of rebuilds (collsions): 2 number of rebuilds (collsions): 0 3- inserting 46 elements 3- inserting 18 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 4- inserting 99 elements 4- inserting 37 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 5- inserting 79 elements 5- inserting 47 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 6- inserting 88 elements 6- inserting 11 elements number of rebuilds (collsions): 1 number of rebuilds (collsions): 0 7- inserting 87 elements 7- inserting 56 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 8- inserting 27 elements 8- inserting 118 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 9- inserting 69 elements 9- inserting 39 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 10- inserting 73 elements 10- inserting 138 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 11- inserting 83 elements 11- inserting 132 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 12- inserting 1 elements 12- inserting 115 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 13- inserting 6 elements 13- inserting 31 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 14- inserting 86 elements 14- inserting 68 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 15- inserting 1 elements 15- inserting 87 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 16- inserting 38 elements 16- inserting 57 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 17- inserting 51 elements 17- inserting 69 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 1 18- inserting 68 elements 18- inserting 84 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 19- inserting 58 elements 19- inserting 87 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 20- inserting 46 elements 20- inserting 10 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0

Test $5 - O(N^2)$ -Space Test $6 - O(N^2)$ -Space entered size 200 entered size 250 built hashtable with size 65536 built hashtable with size 65536 the table is 1.6384 n^2 the table is 1.048576 n^2 inserting variable length samples 20 times inserting variable length samples 20 times 1- inserting 51 elements 1- inserting 111 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 2- inserting 123 elements 2- inserting 48 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 3- inserting 142 elements 3- inserting 131 elements number of rebuilds (collsions): 1 number of rebuilds (collsions): 1 4- inserting 13 elements 4- inserting 1 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 5- inserting 66 elements 5- inserting 169 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 6- inserting 23 elements 6- inserting 225 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 2 7- inserting 76 elements 7- inserting 222 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 8- inserting 163 elements 8- inserting 144 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 9- inserting 104 elements 9- inserting 34 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 10- inserting 33 elements 10- inserting 144 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 11- inserting 54 elements 11- inserting 167 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 12- inserting 159 elements 12- inserting 30 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 13- inserting 109 elements 13- inserting 107 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 14- inserting 142 elements 14- inserting 11 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 1 15- inserting 43 elements 15- inserting 67 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 16- inserting 83 elements 16- inserting 107 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 1 17- inserting 27 elements 17- inserting 86 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 18- inserting 9 elements 18- inserting 156 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 19- inserting 27 elements 19- inserting 177 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 20- inserting 167 elements 20- inserting 185 elements number of rebuilds (collsions): 1 number of rebuilds (collsions): 0

Test $7 - O(N^2)$ -Space Test $8 - O(N^2)$ -Space entered size 300 entere<u>d size 350</u> built hashtable with size 131072 built hashtable with size 131072 the table is 1.456355555555556 n^2 the table is 1.0699755102040815 n^2 inserting variable length samples 20 times inserting variable length samples 20 times 1- inserting 167 elements 1- inserting 59 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 2- inserting 230 elements 2- inserting 7 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 3- inserting 114 elements 3- inserting 5 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 4- inserting 280 elements 4- inserting 205 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 5- inserting 106 elements 5- inserting 22 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 6- inserting 29 elements 6- inserting 135 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 7- inserting 262 elements 7- inserting 264 elements number of rebuilds (collsions): 1 number of rebuilds (collsions): 0 8- inserting 197 elements 8- inserting 9 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 9- inserting 86 elements 9- inserting 131 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 10- inserting 106 elements 10- inserting 342 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 11- inserting 44 elements 11- inserting 228 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 2 12- inserting 212 elements 12- inserting 40 elements number of rebuilds (collsions): 1 number of rebuilds (collsions): 0 13- inserting 276 elements 13- inserting 345 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 14- inserting 16 elements 14- inserting 254 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 15- inserting 7 elements 15- inserting 124 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 16- inserting 18 elements 16- inserting 245 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 17- inserting 200 elements 17- inserting 78 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 18- inserting 20 elements 18- inserting 18 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 19- inserting 34 elements 19- inserting 239 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0 20- inserting 193 elements 20- inserting 23 elements number of rebuilds (collsions): 0 number of rebuilds (collsions): 0

O(N)-Space Test cases

These tests verify that, for each sample, the space required is O(N) & show the collisions that happened in the 2 levels and the number of rebuilds.

```
Test 1 - O(N)-Space
entered size 15
built hashtable with 16 Buckets
inserting variable length samples 20 times
1- inserting 6 elements
   the table is 0(0.4 \text{ n})-Space
   level \{1,2\} collisions : \{0,0\}
   number of rebuilds : 0
                                                   11- inserting 11 elements
2- inserting 0 elements
                                                      the table is 0(1.0 \text{ n})-Space
   the table is 0(0.0 \text{ n})-Space
                                                      level \{1,2\} collisions : \{2, 1\}
   level \{1,2\} collisions : \{0,0\}
                                                      number of rebuilds : 0
   number of rebuilds: 0
                                                   12- inserting 2 elements
                                                      3- inserting 13 elements
   the table is 0(1.8 \text{ n})-Space
                                                      level \{1,2\} collisions : \{1,0\}
                                                      number of rebuilds: 0
   level \{1,2\} collisions : \{4,3\}
                                                   13- inserting 3 elements
   number of rebuilds: 0
                                                      the table is 0(0.2 \text{ n})-Space
4- inserting 9 elements
                                                      level \{1,2\} collisions : \{0,0\}
   the table is 0(1.0 \text{ n})-Space
                                                      number of rebuilds : 0
   level \{1,2\} collisions : \{3,1\}
                                                   14- inserting 5 elements
   number of rebuilds : 0
                                                      the table is O(0.466666666666667 n)-Space
5- inserting 9 elements
                                                      level \{1,2\} collisions : \{1,0\}
   the table is O(0.733333333333333 n)-Space
                                                      number of rebuilds : 0
   level \{1,2\} collisions : \{1,0\}
                                                   15- inserting 2 elements
                                                      the table is 0(0.2666666666666666 n)-Space
   number of rebuilds : 0
                                                      level \{1,2\} collisions : \{1,0\}
6- inserting 15 elements
                                                      number of rebuilds : 0
   the table is O(1.533333333333334 n)-Space
                                                   16- inserting 3 elements
   level \{1,2\} collisions : \{4,0\}
                                                      the table is O(0.2 n)-Space
   number of rebuilds: 0
                                                      level \{1,2\} collisions : \{0,0\}
7- inserting 14 elements
                                                      number of rebuilds: 0
   the table is 0(3.06666666666667 n)-Space
                                                   17- inserting 3 elements
   level \{1,2\} collisions : \{7,0\}
                                                      the table is O(0.2 n)-Space
   number of rebuilds: 0
                                                      level \{1,2\} collisions : \{0,0\}
8- inserting 6 elements
                                                      number of rebuilds : 0
                                                   18- inserting 13 elements
   the table is 0(0.4 \text{ n})-Space
                                                      the table is O(1.866666666666667 n)-Space
   level \{1,2\} collisions : \{0,0\}
                                                      level \{1,2\} collisions : \{3,1\}
   number of rebuilds: 0
                                                      number of rebuilds: 0
9- inserting 14 elements
                                                   19- inserting 11 elements
   the table is 0(2.06666666666667 n)-Space
                                                      the table is O(1.133333333333333 n)-Space
   level \{1,2\} collisions : \{4,0\}
                                                      level \{1,2\} collisions : \{3, 1\}
   number of rebuilds : 0
                                                      number of rebuilds : 0
10- inserting 10 elements
                                                   20- inserting 9 elements
   the table is O(1.066666666666667 n)-Space
                                                      the table is O(0.866666666666667 n)-Space
   level \{1,2\} collisions : \{3,2\}
                                                      level \{1,2\} collisions : \{2,0\}
   number of rebuilds: 0
                                                      number of rebuilds: 0
```

Test 2 - O(N)-Space entered size 50 built hashtable with 64 Buckets 11- inserting 15 elements inserting variable length samples 20 times the table is O(0.42 n)-Space 1- inserting 37 elements level $\{1,2\}$ collisions : $\{3,0\}$ the table is 0(1.16 n)-Space number of rebuilds: 0 level {1,2} collisions : {6, 4} 12- inserting 32 elements number of rebuilds : 0 the table is O(0.96 n)-Space 2- inserting 36 elements level $\{1,2\}$ collisions : $\{5,1\}$ the table is 0(0.96 n)-Space number of rebuilds: 0 level {1,2} collisions : {6, 1} 13- inserting 32 elements number of rebuilds: 0 the table is O(0.8 n)-Space 3- inserting 15 elements level $\{1,2\}$ collisions : $\{4,3\}$ the table is 0(0.58 n)-Space number of rebuilds: 0 level $\{1,2\}$ collisions : $\{4,0\}$ 14- inserting 3 elements number of rebuilds: 0 the table is O(0.06 n)-Space 4- inserting 34 elements level $\{1,2\}$ collisions : $\{0,0\}$ the table is O(1.3 n)-Space number of rebuilds: 0 level {1,2} collisions : {11, 3} 15- inserting 0 elements number of rebuilds: 0 5- inserting 18 elements the table is O(0.0 n)-Space level {1,2} collisions : {0, 0} the table is O(0.48 n)-Space level {1,2} collisions : {3, 0} number of rebuilds : 0 number of rebuilds: 0 16- inserting 50 elements 6- inserting 15 elements the table is O(2.26 n)-Space the table is 0(0.34 n)-Space level {1,2} collisions : {15, 4} level $\{1,2\}$ collisions : $\{1,0\}$ number of rebuilds: 0 number of rebuilds: 0 17- inserting 34 elements 7- inserting 53 elements the table is O(1.26 n)-Space the table is 0(2.14 n)-Space level {1,2} collisions : {7, 1} level {1,2} collisions : {15, 1} number of rebuilds : 0 number of rebuilds: 0 18- inserting 44 elements 8- inserting 16 elements the table is 0(1.44 n)-Space the table is 0(0.36 n)-Space level {1,2} collisions : {14, 5} level $\{1,2\}$ collisions : $\{1,0\}$ number of rebuilds: 0 number of rebuilds: 0 19- inserting 21 elements 9- inserting 25 elements the table is O(0.5 n)-Space the table is O(0.88 n)-Space level $\{1,2\}$ collisions : $\{2,1\}$ level {1,2} collisions : {5, 3} number of rebuilds: 0 number of rebuilds : 0 20- inserting 34 elements 10- inserting 49 elements the table is 0(1.36 n)-Space the table is O(2.38 n)-Space level $\{1,2\}$ collisions : $\{8,1\}$ level {1,2} collisions : {17, 5}

number of rebuilds: 0

number of rebuilds: 0

Test 3 - O(N)-Space entered size 100 built hashtable with 128 Buckets 11- inserting 70 elements inserting variable length samples 20 times the table is O(1.27 n)-Space 1- inserting 115 elements level {1,2} collisions : {18, 5} the table is 0(2.56 n)-Space number of rebuilds: 0 level {1,2} collisions : {36, 12} 12- inserting 85 elements number of rebuilds : 0 the table is O(1.58 n)-Space 2- inserting 39 elements level $\{1,2\}$ collisions : $\{23,5\}$ the table is 0(0.51 n)-Space number of rebuilds: 0 level {1,2} collisions : {6, 2} 13- inserting 97 elements number of rebuilds: 0 the table is O(2.08 n)-Space 3- inserting 89 elements level {1,2} collisions : {30, 13} the table is O(1.75 n)-Space number of rebuilds : 0 level {1,2} collisions : {25, 10} 14- inserting 111 elements number of rebuilds: 0 the table is 0(2.89 n)-Space 4- inserting 27 elements level {1,2} collisions : {39, 11} the table is O(0.31 n)-Space number of rebuilds: 0 level $\{1,2\}$ collisions : $\{2,0\}$ 15- inserting 88 elements number of rebuilds: 0 5- inserting 21 elements the table is O(1.43 n)-Space level {1,2} collisions : {23, 6} the table is O(0.27 n)-Space level $\{1,2\}$ collisions : $\{3,0\}$ number of rebuilds: 0 number of rebuilds : 0 16- inserting 93 elements 6- inserting 102 elements the table is O(1.44 n)-Space the table is O(2.35 n)-Space level {1,2} collisions : {21, 10} level {1,2} collisions : {32, 5} number of rebuilds: 0 number of rebuilds : 0 17- inserting 65 elements 7- inserting 27 elements the table is O(1.15 n)-Space the table is O(0.27 n)-Space level {1,2} collisions : {16, 1} level {1,2} collisions : {0, 0} number of rebuilds: 0 number of rebuilds : 0 18- inserting 33 elements 8- inserting 43 elements the table is O(0.41 n)-Space the table is O(0.61 n)-Space level $\{1,2\}$ collisions : $\{4,0\}$ level $\{1,2\}$ collisions : $\{9,1\}$ number of rebuilds: 0 number of rebuilds: 0 19- inserting 116 elements 9- inserting 40 elements the table is O(2.96 n)-Space the table is 0(0.44 n)-Space level {1,2} collisions : {43, 6} level $\{1,2\}$ collisions : $\{2,0\}$ number of rebuilds: 0 number of rebuilds: 0 20- inserting 71 elements 10- inserting 79 elements the table is 0(1.22 n)-Space the table is O(1.72 n)-Space level {1,2} collisions : {18, 3} level {1,2} collisions : {24, 5} number of rebuilds : 0 number of rebuilds: 0

Test 4 - O(N)-Space entered size 150 built hashtable with 256 Buckets inserting variable length samples 20 times 1- inserting 201 elements the table is O(2.97333333333333 n)-Space level {1,2} collisions : {61, 14} number of rebuilds: 0 2- inserting 75 elements the table is O(0.59333333333333 n)-Space level $\{1,2\}$ collisions : $\{7,0\}$ number of rebuilds : 0 3- inserting 23 elements level $\{1,2\}$ collisions : $\{1,0\}$ number of rebuilds : 0 4- inserting 50 elements the table is 0(0.36 n)-Space level {1,2} collisions : {2, 1} number of rebuilds: 0 5- inserting 149 elements the table is O(1.873333333333333 n)-Space level {1,2} collisions : {36, 7} number of rebuilds: 0 6- inserting 77 elements the table is 0(0.62 n)-Space level $\{1,2\}$ collisions : $\{8,3\}$ number of rebuilds: 0 7- inserting 10 elements the table is 0(0.066666666666667 n)-Space level $\{1,2\}$ collisions : $\{0,0\}$ number of rebuilds: 0 8- inserting 51 elements the table is O(0.39333333333333 n)-Space level $\{1,2\}$ collisions : $\{4,1\}$ number of rebuilds: 0 9- inserting 70 elements the table is O(0.62 n)-Space level $\{1,2\}$ collisions : $\{7,6\}$

number of rebuilds: 0

number of rebuilds: 0

level $\{1,2\}$ collisions : $\{0,0\}$

the table is 0(0.0066666666666667 n)-Space

10- inserting 1 elements

```
11- inserting 165 elements
   the table is 0(2.64 \text{ n})-Space
   level {1,2} collisions : {49, 13}
   number of rebuilds : 0
12- inserting 221 elements
   the table is 0(3.52 \text{ n})-Space
   level {1,2} collisions : {74, 16}
   number of rebuilds: 0
13- inserting 178 elements
   the table is O(2.413333333333333 n)-Space
   level {1,2} collisions : {53, 16}
   number of rebuilds: 0
14- inserting 134 elements
   the table is O(1.6 n)-Space
   level {1,2} collisions : {35, 8}
   number of rebuilds : 0
15- inserting 223 elements
   the table is 0(3.8266666666666667 n)-Space
   level {1,2} collisions : {79, 22}
   number of rebuilds : 0
16- inserting 28 elements
   the table is 0(0.2266666666666666 n)-Space
   level \{1,2\} collisions : \{3,0\}
   number of rebuilds: 0
17- inserting 144 elements
   the table is O(1.62 n)-Space
   level {1,2} collisions : {27, 3}
   number of rebuilds: 0
18- inserting 233 elements
   the table is 0(3.93333333333333 n)-Space
   level {1,2} collisions : {90, 26}
   number of rebuilds: 0
19- inserting 235 elements
   the table is O(3.54666666666667 n)-Space
   level {1,2} collisions : {78, 15}
   number of rebuilds: 0
20- inserting 14 elements
   the table is O(0.0933333333333334 n)-Space
   level \{1,2\} collisions : \{0,0\}
   number of rebuilds: 0
```

Test 5 - O(N)-Space entered size 200 built hashtable with 256 Buckets inserting variable length samples 20 times 1- inserting 163 elements the table is O(1.59 n)-Space level {1,2} collisions : {40, 14} number of rebuilds: 0 2- inserting 128 elements the table is O(0.965 n)-Space level {1,2} collisions : {25, 8} number of rebuilds : 0 3- inserting 173 elements the table is O(1.62 n)-Space level {1,2} collisions : {44, 14} number of rebuilds: 0 4- inserting 192 elements the table is O(2.05 n)-Space level {1,2} collisions : {61, 23} number of rebuilds: 0 5- inserting 153 elements the table is O(1.445 n)-Space level {1,2} collisions : {35, 12} number of rebuilds: 0 6- inserting 37 elements the table is O(0.235 n)-Space level $\{1,2\}$ collisions : $\{5,1\}$ number of rebuilds : 0 7- inserting 25 elements the table is O(0.145 n)-Space level $\{1,2\}$ collisions : $\{2,0\}$ number of rebuilds: 0 8- inserting 121 elements the table is 0(0.955 n)-Space level {1,2} collisions : {26, 8} number of rebuilds: 0 9- inserting 203 elements the table is 0(2.1 n)-Space level {1,2} collisions : {65, 17} number of rebuilds : 0 10- inserting 187 elements the table is 0(2.045 n)-Space level {1,2} collisions : {57, 8}

number of rebuilds: 0

```
11- inserting 229 elements
   the table is O(2.625 n)-Space
   level {1,2} collisions : {74, 20}
   number of rebuilds : 0
12- inserting 161 elements
   the table is O(1.62 n)-Space
   level {1,2} collisions : {41, 14}
   number of rebuilds: 0
13- inserting 150 elements
   the table is 0(1.31 \text{ n})-Space
   level {1,2} collisions : {35, 8}
   number of rebuilds: 0
14- inserting 250 elements
   the table is 0(3.33 \text{ n})-Space
   level {1,2} collisions : {100, 21}
   number of rebuilds : 0
15- inserting 93 elements
   the table is 0(0.67 n)-Space
   level {1,2} collisions : {16, 2}
   number of rebuilds: 0
16- inserting 222 elements
   the table is O(2.285 n)-Space
   level {1,2} collisions : {72, 14}
   number of rebuilds : 0
17- inserting 230 elements
   the table is O(2.47 n)-Space
   level {1,2} collisions : {70, 15}
   number of rebuilds : 0
18- inserting 68 elements
   the table is O(0.445 n)-Space
   level \{1,2\} collisions : \{6,0\}
   number of rebuilds : 0
19- inserting 174 elements
   the table is 0(1.92 \text{ n})-Space
   level {1,2} collisions : {51, 6}
   number of rebuilds: 0
20- inserting 39 elements
   the table is O(0.205 \text{ n})-Space
   level \{1,2\} collisions : \{1,3\}
   number of rebuilds: 0
```

Test 6 - O(N)-Space entered size 250 built hashtable with 256 Buckets inserting variable length samples 20 times 11- inserting 145 elements 1- inserting 205 elements the table is O(1.056 n)-Space the table is O(1.712 n)-Space level {1,2} collisions : {37, 1} level {1,2} collisions : {62, 22} number of rebuilds: 0 number of rebuilds : 0 12- inserting 60 elements 2- inserting 191 elements the table is 0(0.28 n)-Space the table is O(1.656 n)-Space level $\{1,2\}$ collisions : $\{5,2\}$ level {1,2} collisions : {59, 7} number of rebuilds : 0 number of rebuilds : 0 13- inserting 164 elements 3- inserting 220 elements the table is O(1.148 n)-Space the table is O(1.964 n)-Space level {1,2} collisions : {42, 10} level {1,2} collisions : {71, 27} number of rebuilds : 0 number of rebuilds: 0 14- inserting 204 elements 4- inserting 118 elements the table is O(1.948 n)-Space the table is O(0.704 n)-Space level {1,2} collisions : {65, 13} level {1,2} collisions : {20, 8} number of rebuilds: 0 number of rebuilds : 0 15- inserting 221 elements 5- inserting 85 elements the table is O(1.708 n)-Space the table is O(0.456 n)-Space level {1,2} collisions : {64, 10} level {1,2} collisions : {10, 0} number of rebuilds: 0 number of rebuilds: 0 16- inserting 30 elements 6- inserting 216 elements the table is 0(0.136 n)-Space the table is O(1.768 n)-Space level $\{1,2\}$ collisions : $\{2,1\}$ level {1,2} collisions : {71, 9} number of rebuilds: 0 number of rebuilds : 0 17- inserting 222 elements 7- inserting 182 elements the table is O(1.952 n)-Space the table is O(1.72 n)-Space level {1,2} collisions : {71, 24} level {1,2} collisions : {59, 9} number of rebuilds : 0 number of rebuilds : 0 18- inserting 129 elements 8- inserting 97 elements the table is O(0.892 n)-Space the table is O(0.664 n)-Space level {1,2} collisions : {29, 7} level {1,2} collisions : {21, 6} number of rebuilds: 0 number of rebuilds : 0 19- inserting 217 elements 9- inserting 230 elements the table is O(1.808 n)-Space the table is 0(2.32 n)-Space level {1,2} collisions : {68, 19} level {1,2} collisions : {86, 15} number of rebuilds: 0 number of rebuilds: 0 10- inserting 94 elements 20- inserting 218 elements the table is O(2.228 n)-Space the table is O(0.456 n)-Space level {1,2} collisions : {10, 3} level {1,2} collisions : {78, 12} number of rebuilds : 0 number of rebuilds : 0

Test 7 - O(N)-Space entered size 300 built hashtable with 512 Buckets inserting variable length samples 20 times 1- inserting 287 elements the table is 0(1.45333333333333 n)-Space level {1,2} collisions : {58, 8} 11- inserting 441 elements number of rebuilds: 0 the table is 0(3.37 n)-Space 2- inserting 438 elements level {1,2} collisions : {152, 40} the table is 0(3.29666666666667 n)-Space number of rebuilds : 0 12- inserting 195 elements level {1,2} collisions : {145, 32} the table is 0(1.14 n)-Space number of rebuilds: 0 level {1,2} collisions : {39, 12} 3- inserting 71 elements number of rebuilds : 0 the table is 0(0.2766666666666667 n)-Space 13- inserting 413 elements level $\{1,2\}$ collisions : $\{6,0\}$ the table is 0(2.98666666666667 n)-Space number of rebuilds: 0 level {1,2} collisions : {126, 27} 4- inserting 165 elements number of rebuilds: 0 the table is 0(0.77 n)-Space 14- inserting 207 elements level {1,2} collisions : {24, 4} the table is O(1.023333333333334 n)-Space number of rebuilds: 0 level {1,2} collisions : {41, 15} 5- inserting 426 elements number of rebuilds : 0 the table is O(3.17333333333333 n)-Space 15- inserting 377 elements level {1,2} collisions : {140, 37} the table is 0(2.503333333333334 n)-Space number of rebuilds: 0 level {1,2} collisions : {107, 21} 6- inserting 227 elements number of rebuilds : 0 the table is O(1.203333333333334 n)-Space 16- inserting 124 elements level {1,2} collisions : {49, 20} the table is O(0.573333333333334 n)-Space level {1,2} collisions : {15, 2} number of rebuilds: 0 number of rebuilds: 0 7- inserting 335 elements 17- inserting 388 elements the table is O(2.286666666666666 n)-Space the table is 0(2.77666666666667 n)-Space level {1,2} collisions : {96, 21} level {1,2} collisions : {114, 24} number of rebuilds: 0 number of rebuilds : 0 8- inserting 472 elements 18- inserting 99 elements the table is 0(3.81 n)-Space the table is 0(0.376666666666666 n)-Space level {1,2} collisions : {164, 42} level $\{1,2\}$ collisions : $\{7,0\}$ number of rebuilds: 0 number of rebuilds: 0 9- inserting 299 elements 19- inserting 396 elements the table is O(1.753333333333334 n)-Space the table is O(2.70333333333333 n)-Space level {1,2} collisions : {76, 23} level {1,2} collisions : {120, 30} number of rebuilds : 0 number of rebuilds: 0 10- inserting 454 elements 20- inserting 4 elements the table is 0(0.0133333333333333 n)-Space the table is 0(3.56 n)-Space level {1,2} collisions : {151, 36} level $\{1,2\}$ collisions : $\{0,0\}$ number of rebuilds: 0 number of rebuilds : 0

Test 8 - O(N)-Space entered size 350 built hashtable with 512 Buckets inserting variable length samples 20 times 1- inserting 376 elements the table is 0(2.374285714285714 n)-Space level {1,2} collisions : {111, 25} number of rebuilds: 0 2- inserting 95 elements the table is O(0.38571428571428573 n)-Space level {1,2} collisions : {11, 1} number of rebuilds: 0 3- inserting 149 elements the table is O(0.5542857142857143 n)-Space level {1,2} collisions : {18, 4} number of rebuilds: 0 4- inserting 122 elements the table is 0(0.5085714285714286 n)-Space level {1,2} collisions : {19, 4} number of rebuilds: 0 5- inserting 261 elements the table is O(1.2885714285714285 n)-Space level {1,2} collisions : {56, 18} number of rebuilds: 0 6- inserting 124 elements the table is 0(0.4228571428571429 n)-Space level {1,2} collisions : {12, 4} number of rebuilds : 0 7- inserting 465 elements the table is O(2.902857142857143 n)-Space level {1,2} collisions : {152, 34} number of rebuilds: 0 8- inserting 33 elements the table is O(0.1 n)-Space level $\{1,2\}$ collisions : $\{1,0\}$ number of rebuilds: 0 9- inserting 109 elements the table is 0(0.43142857142857144 n)-Space level {1,2} collisions : {12, 2} number of rebuilds: 0 10- inserting 509 elements the table is O(3.662857142857143 n)-Space level {1,2} collisions : {186, 29}

number of rebuilds: 0

```
11- inserting 333 elements
   the table is O(1.76 n)-Space
   level {1,2} collisions : {80, 15}
   number of rebuilds: 0
12- inserting 302 elements
   the table is O(1.4885714285714287 n)-Space
   level {1,2} collisions : {69, 18}
   number of rebuilds : 0
13- inserting 298 elements
   the table is O(1.4514285714285715 n)-Space
   level {1,2} collisions : {64, 14}
   number of rebuilds: 0
14- inserting 485 elements
   the table is O(3.4714285714285715 n)-Space
   level {1,2} collisions : {183, 39}
   number of rebuilds: 0
15- inserting 149 elements
   the table is 0(0.5485714285714286 n)-Space
   level {1,2} collisions : {17, 5}
   number of rebuilds : 0
16- inserting 95 elements
   the table is O(0.2885714285714286 n)-Space
   level \{1,2\} collisions : \{3,4\}
   number of rebuilds: 0
17- inserting 119 elements
   the table is O(0.4085714285714286 n)-Space
   level {1,2} collisions : {12, 4}
   number of rebuilds : 0
18- inserting 375 elements
   the table is O(2.3457142857142856 n)-Space
   level {1,2} collisions : {115, 21}
   number of rebuilds: 0
19- inserting 449 elements
   the table is O(2.874285714285714 n)-Space
   level {1,2} collisions : {154, 36}
   number of rebuilds: 0
20- inserting 104 elements
   the table is O(0.34285714285714286 n)-Space
```

level $\{1,2\}$ collisions : $\{8, 2\}$

number of rebuilds : 0