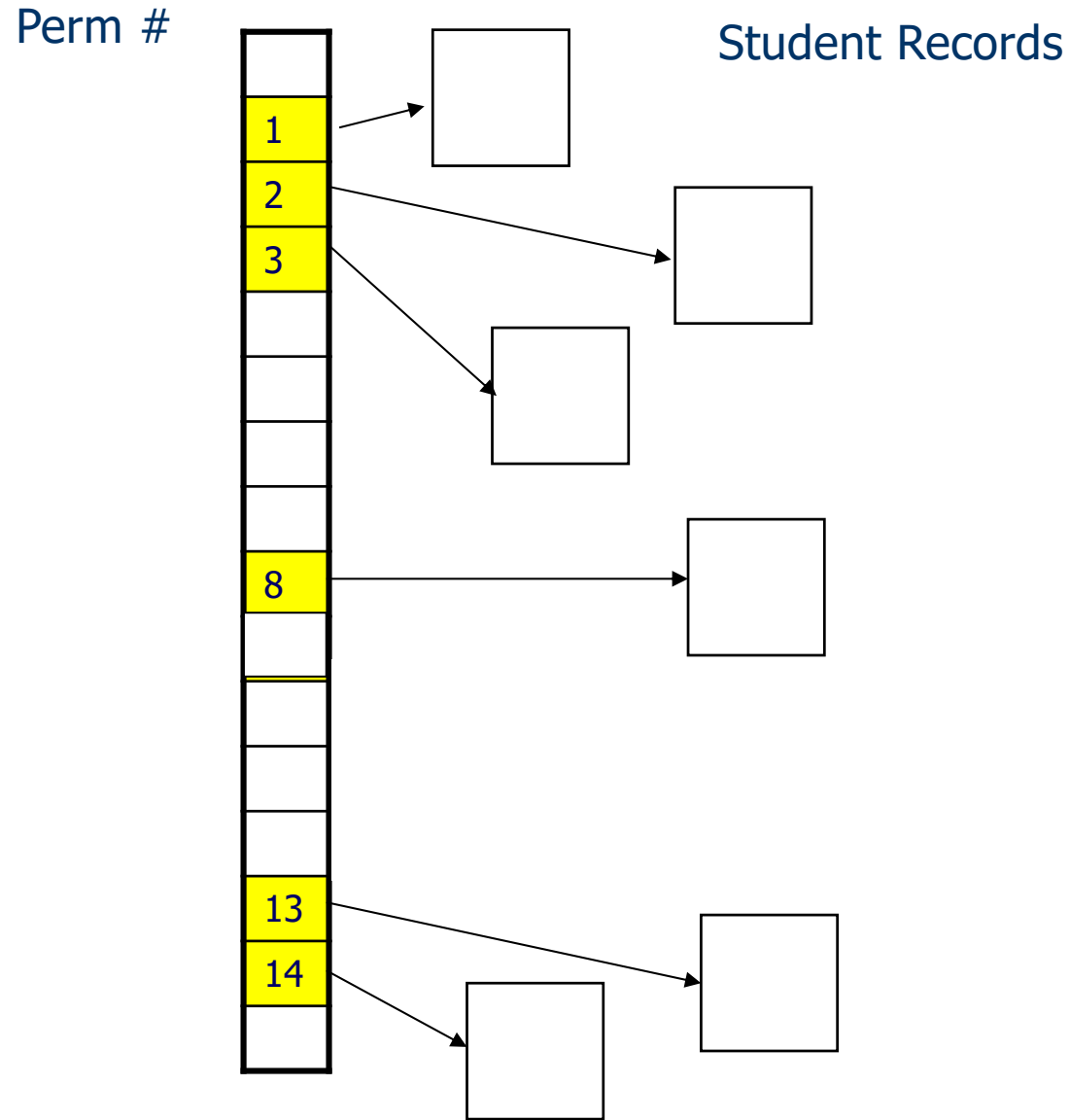


Hash Tables: Intuition

- Hashing is function that maps each key to a location in memory.
- A key's location does not depend on other elements, and does not change after insertion.
 - unlike a sorted list
- A good hash function should be easy to compute.
- With such a hash function, the dictionary operations can be implemented in $O(1)$ time.

One Simple Idea: Direct Mapping



Hashing : the basic idea

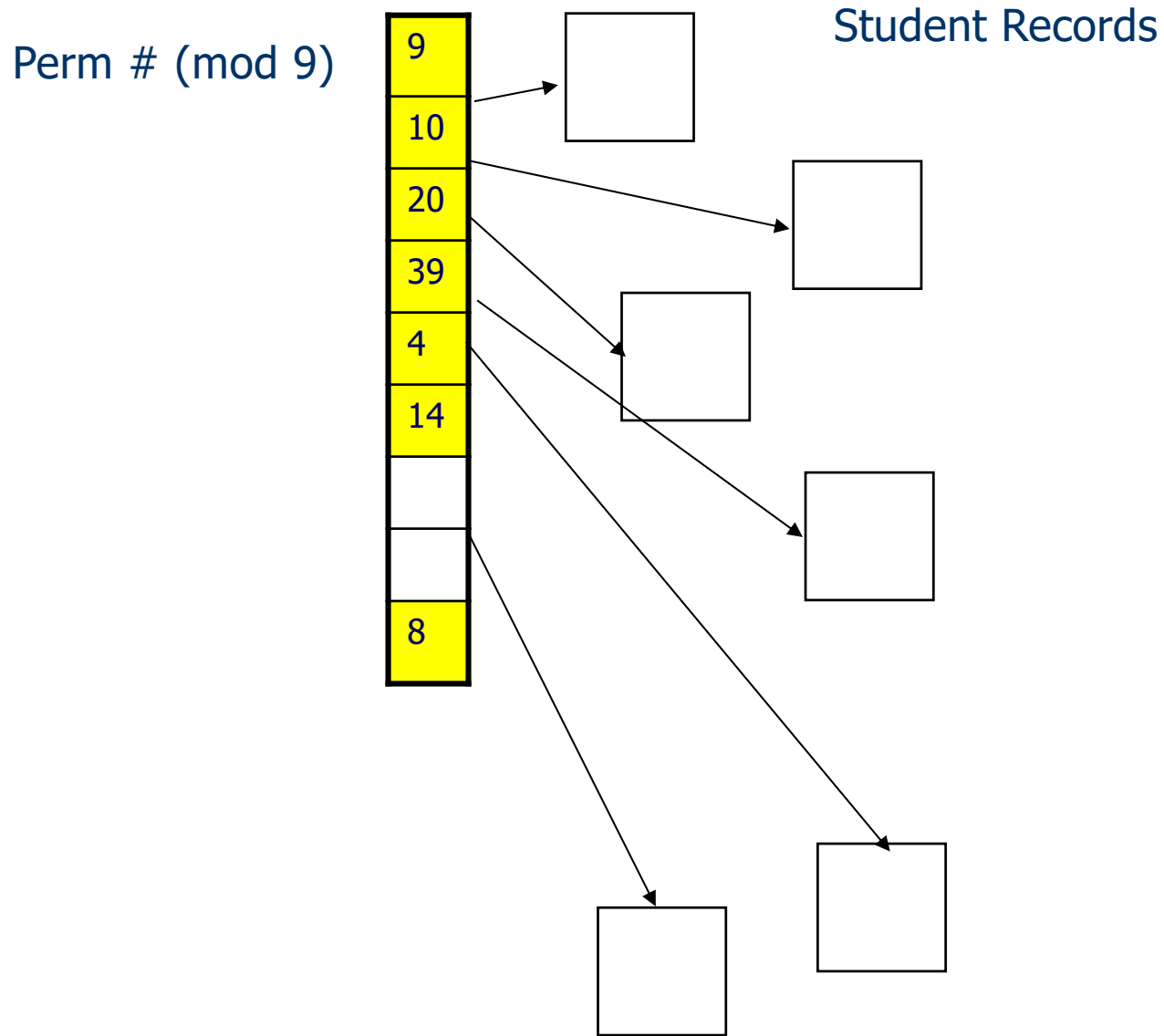
- Map key values to hash table addresses
keys \rightarrow hash table address

This applies to find, insert, and remove

- Usually: *integers \rightarrow $\{0, 1, 2, \dots, Hsize-1\}$*
Typical example: $f(n) = n \bmod Hsize$

- Non-numeric keys converted to numbers
 - *For example, strings converted to numbers as*
 - Sum of ASCII values
 - First three characters

Hashing : the basic idea



Hashing:

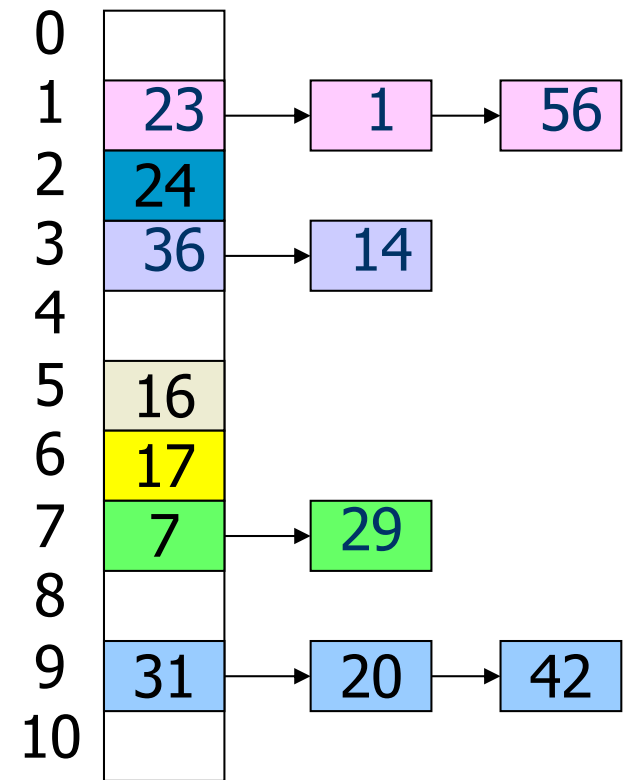
- *Choose a hash function h ; it also determines the hash table size.*
- *Given an item x with key k , put x at location $h(k)$.*
- *To find if x is in the set, check location $h(k)$.*
- *What to do if more than one keys hash to the same value. This is called collision.*
- *We will discuss two methods to handle collision:*
 - Separate chaining
 - Open addressing

Separate chaining

- Maintain a list of all elements that hash to the same value
- Search -- using the hash function to determine which list to traverse

```
find(k,e)
    HashVal = Hash(k,Hsize);
    if (TheList[HashVal].Search(k,e))
        then return true;
    else return false;
```

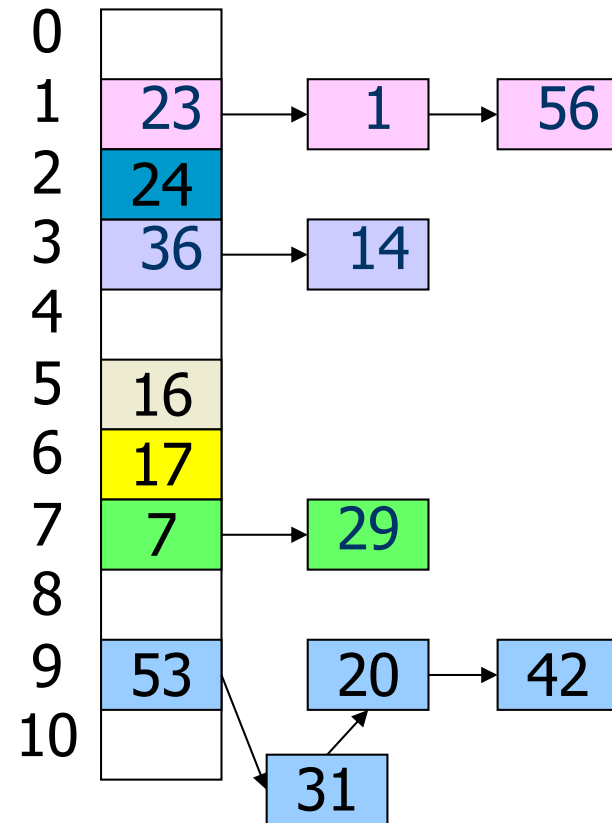
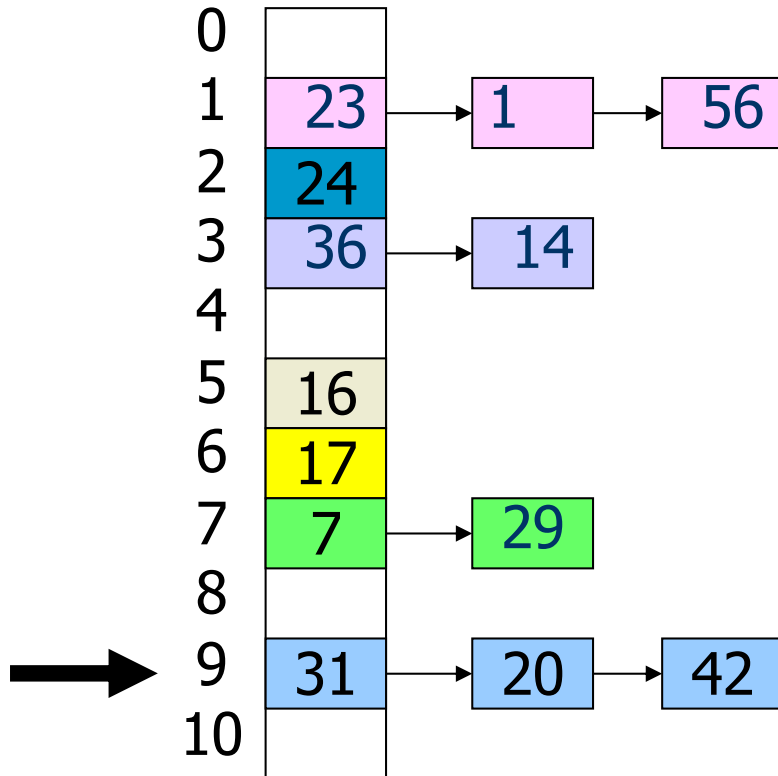
- Insert/deletion--once the “bucket” is found through *Hash*, insert and delete are list operations



```
class HashTable {
    .....
private:
    unsigned int Hsize;
    List<E,K> *TheList;
    .....
}
```

Insertion: insert 53

$$53 = 4 \times 11 + 9$$
$$53 \bmod 11 = 9$$



Analysis of Hashing with Chaining

■ Worst case

- All keys hash into the same bucket
- a single linked list.
- insert, delete, find take $O(n)$ time.

■ Average case

- Keys are uniformly distributed into buckets
- $O(1+N/B)$: N is the number of elements in a hash table, B is the number of buckets.
- If $N = O(B)$, then $O(1)$ time per operation.
- N/B is called the **load factor** of the hash table.

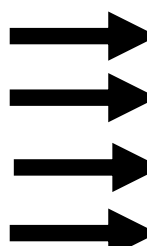
Open addressing

- If collision happens, alternative cells are tried until an empty cell is found.
- Linear probing :
Try next available position

0	42
1	1
2	24
3	14
4	
5	16
6	28
7	7
8	
9	31
10	9

Linear Probing (insert 12)

$$12 = 1 \times 11 + 1$$
$$12 \bmod 11 = 1$$



0	42
1	1
2	24
3	14
4	
5	16
6	28
7	7
8	
9	31
10	9

0	42
1	1
2	24
3	14
4	12
5	16
6	28
7	7
8	
9	31
10	9

Search with linear probing (Search 15)

$$15 = 1 \times 11 + 4$$
$$15 \bmod 11 = 4$$

	0	42
	1	1
	2	24
	3	14
→	4	12
→	5	16
→	6	28
→	7	7
→	8	
	9	31
	10	9

NOT FOUND !

Search with linear probing

```
// find the slot where searched item should be in

int HashTable<E,K>::hSearch(const K& k) const
{
    int HashVal = k % D;
    int j = HashVal;
    do {// don't search past the first empty slot (insert should put it there)
        if (empty[j] || ht[j] == k) return j;
        j = (j + 1) % D;
    } while (j != HashVal);
    return j; // no empty slot and no match either, give up
}

bool HashTable<E,K>::find(const K& k, E& e) const
{
    int b = hSearch(k);
    if (empty[b] || ht[b] != k) return false;
    e = ht[b];
    return true;
}
```

Deletion in Hashing with Linear Probing

- Since empty buckets are used to terminate search, standard deletion does not work.
- One simple idea is to not delete, but mark.
- Insert: put item in first empty or marked bucket.
- Search: Continue past marked buckets.
- Delete: just mark the bucket as deleted.
- Advantage: Easy and correct.
- Disadvantage: table can become full with dead items.

Deletion with linear probing: LAZY (Delete 9)

$$9 = 0 \times 11 + 9$$
$$9 \bmod 11 = 9$$

0	42	
1	1	
2	24	
3	14	
4	12	
5	16	
6	28	
7	7	
8		
9	31	
10	9	FOUND !

0	42	
1	1	
2	24	
3	14	
4	12	
5	16	
6	28	
7	7	
8		
9	31	
10	D	

Eager Deletion: fill holes

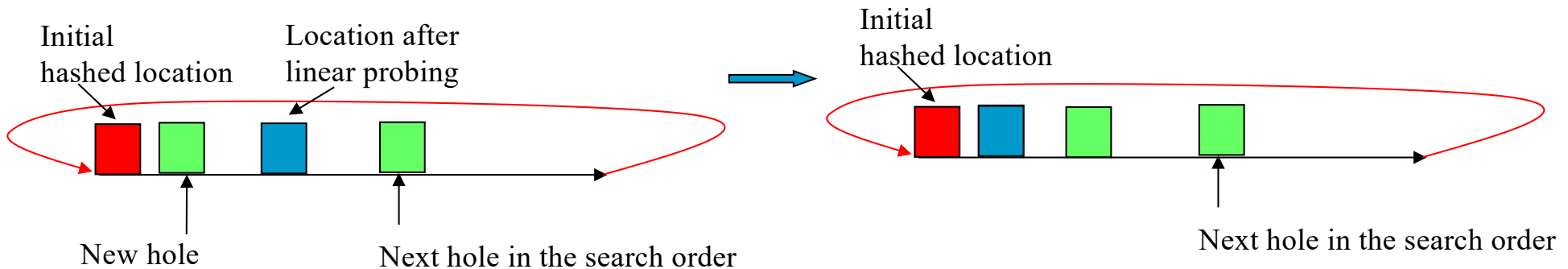
- Remove and find replacement:
 - Fill in the hole for later searches

```
remove(j)
{ i = j;
  empty[i] = true;
  i = (i + 1) % D; // candidate for swapping
  while ((not empty[i]) and i!=j) {
    r = Hash(ht[i]); // where should it go without
collision?
    // can we still find it based on the rehashing strategy?
    if not ((j<r<=i) or (i<j<r) or (r<=i<j))
      then break; // yes find it from rehashing, swap
    i = (i + 1) % D; // no, cannot find it from rehashing
  }
  if (i!=j and not empty[i])
  then {
    ht[j] = ht[i];
    remove(i);
  }
}
```

Eager Deletion Analysis (cont.)

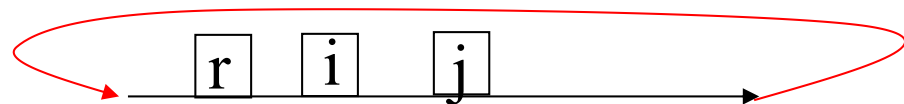
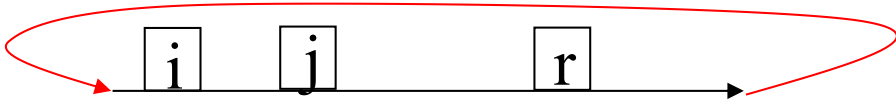
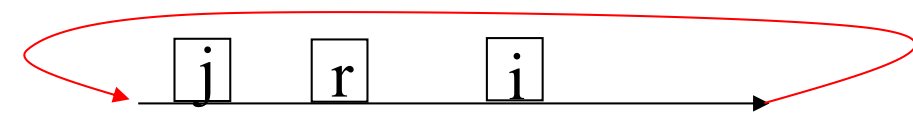
□ If not full

- After deletion, there will be at least two holes
- Elements that are affected by the new hole are
 - Initial hashed location is cyclically before the new hole
 - Location after linear probing is in between the new hole and the next hole in the search order
 - Elements are movable to fill the hole

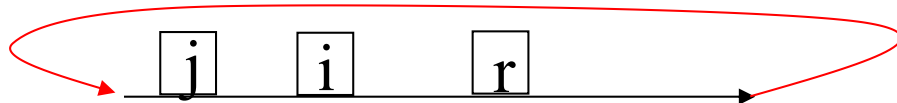


Eager Deletion Analysis (cont.)

- The important thing is to make sure that if a replacement (*i*) is swapped into deleted (*j*), we can still find that element. How can we *not* find it?
 - If the original hashed position (*r*) is circularly in between deleted and the replacement



Will not find *i* past the empty green slot!



Will find *i*



Quadratic Probing

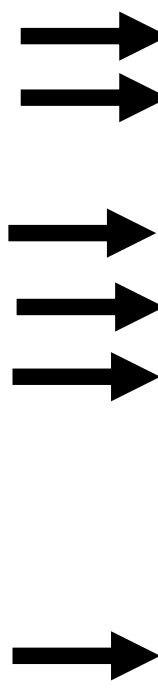
■ *Solves the clustering problem in Linear Probing*

- Check $H(x)$
- If collision occurs check $H(x) + 1$
- If collision occurs check $H(x) + 4$
- If collision occurs check $H(x) + 9$
- If collision occurs check $H(x) + 16$
- ...

- $H(x) + i^2$

Quadratic Probing (insert 12)

$$12 = 1 \times 11 + 1$$
$$12 \bmod 11 = 1$$



0	42
1	1
2	24
3	14
4	
5	16
6	28
7	7
8	
9	31
10	9

0	42
1	1
2	24
3	14
4	12
5	16
6	28
7	7
8	
9	31
10	9

Double Hashing

■ *When collision occurs use a second hash function*

- $\text{Hash}_2(x) = R - (x \bmod R)$
- R: greatest prime number smaller than table-size

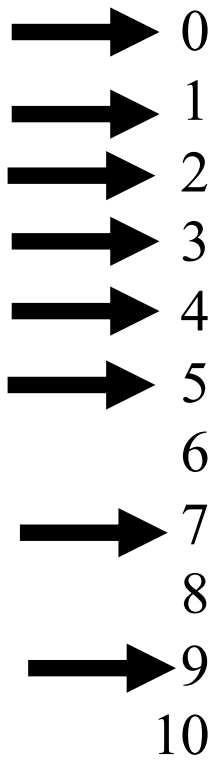
■ *Inserting 12*

$$H_2(x) = 7 - (x \bmod 7) = 7 - (12 \bmod 7) = 2$$

- Check $H(x)$
- If collision occurs check $H(x) + 2$
- If collision occurs check $H(x) + 4$
- If collision occurs check $H(x) + 6$
- If collision occurs check $H(x) + 8$
- $H(x) + i * H_2(x)$

Double Hashing (insert 12)

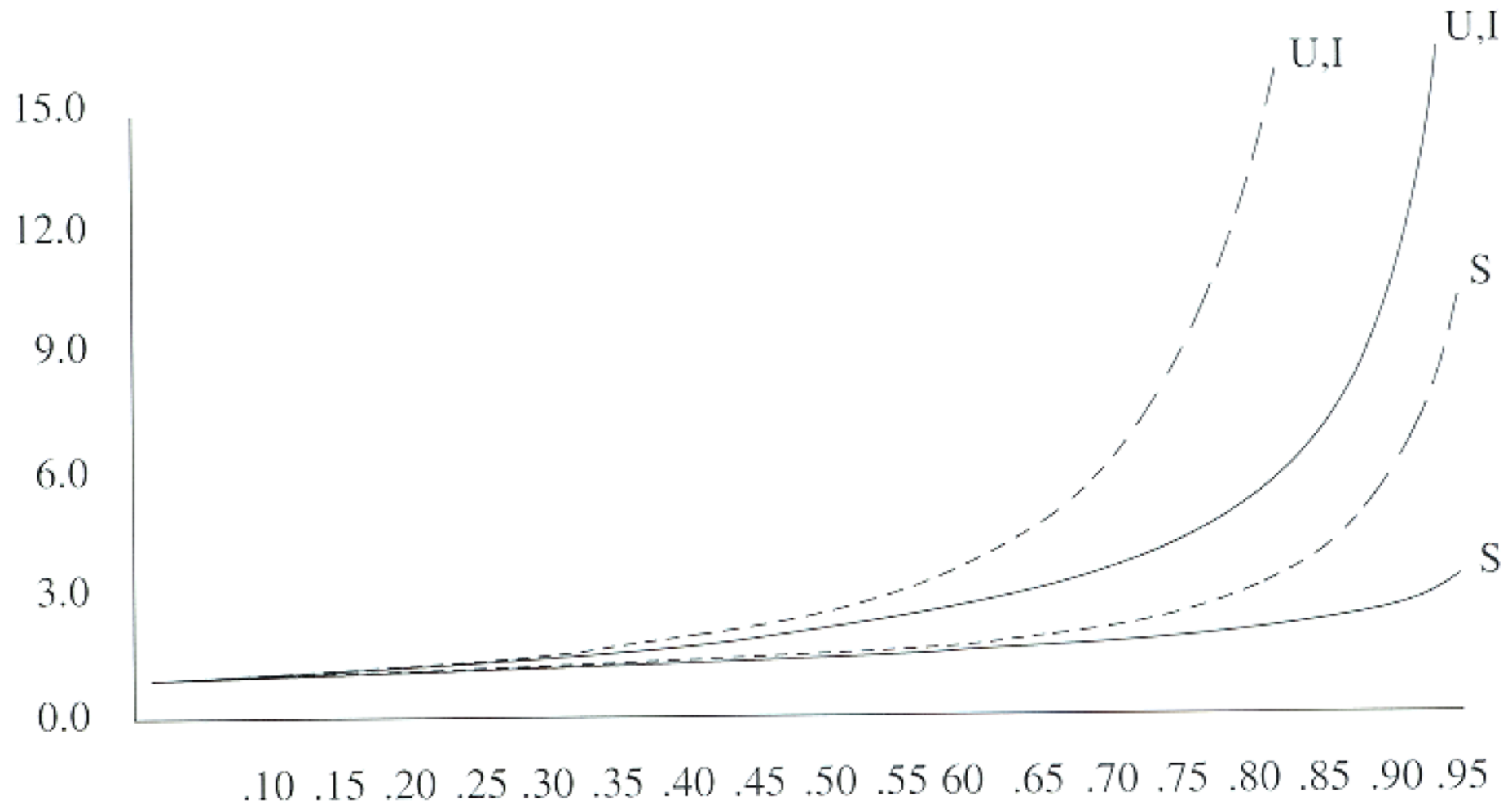
$$\begin{aligned}12 &= 1 \times 11 + 1 \\12 \bmod 11 &= 1 \\7 - 12 \bmod 7 &= 2\end{aligned}$$



0	42
1	1
2	24
3	14
4	
5	16
6	28
7	7
8	
9	31
10	9

0	42
1	1
2	24
3	14
4	12
5	16
6	28
7	7
8	
9	31
10	9

Comparison of linear and random probing



Rehashing

- If table gets too full, operations will take too long.
- Build another table, twice as big (and prime).
 - Next prime number after 11×2 is 23
- Insert every element again to this table
- Rehash after a percentage of the table becomes full (70% for example)

Good and Bad Hashing Functions

- Hash using the wrong key
 - Age of a student
- Hash using limited information
 - First letter of last names (a lot of A's, few Z's)
- Hash functions choices :
 - keys evenly distributed in the hash table
- Even distribution guaranteed by “randomness”
 - No expectation of outcomes
 - Cannot design input patterns to defeat randomness

Examples of Hashing Function

- $B=100, N=100, \text{keys} = A0, A1, \dots, A99$
- $\text{Hashing}(A12) = (\text{Ascii}(A) + \text{Ascii}(1) + \text{Ascii}(2)) / B$
 - $H(A18) = H(A27) = H(A36) = H(A45) \dots$
 - Theoretically, $N(1+N/B) = 200$
 - In reality, 395 steps are needed because of collision
- How to fix it?
 - $\text{Hashing}(A12) = (\text{Ascii}(A) * 2^2 + \text{Ascii}(1) * 2 + \text{Ascii}(2)) / B$
 - $H(A12) \neq H(A21)$
- Examples: numerical keys
 - Use X^2 and take middle numbers

Collision Functions

- $H_i(x) = (H(x) + i) \bmod B$
 - Linear probing
- $H_i(x) = (H(x) + ci) \bmod B \ (c > 1)$
 - Linear probing with step-size = c
- $H_i(x) = (H(x) + i^2) \bmod B$
 - Quadratic probing
- $H_i(x) = (H(x) + i * H_2(x)) \bmod B$

Analysis of Open Hashing

- Effort of **one** Insert?
 - Intuitively - that depends on how full the hash is
- Effort of an **average** Insert?
- Effort to fill the Bucket to a certain capacity?
 - Intuitively - **accumulated** efforts in inserts
- Effort to search an item (both *successful* and *unsuccessful*)?
- Effort to delete an item (both *successful* and *unsuccessful*)?
 - Same effort for successful search and delete?
 - Same effort for unsuccessful search and delete?

More on hashing

- Extensible hashing

- Hash table grows and shrinks, similar to B-trees

Issues:

■ *What do we lose?*

- Operations that require ordering are inefficient
- FindMax: $O(n)$ $O(\log n)$ Balanced binary tree
- FindMin: $O(n)$ $O(\log n)$ Balanced binary tree
- PrintSorted: $O(n \log n)$ $O(n)$ Balanced binary tree

■ *What do we gain?*

- Insert: $O(1)$ $O(\log n)$ Balanced binary tree
- Delete: $O(1)$ $O(\log n)$ Balanced binary tree
- Find: $O(1)$ $O(\log n)$ Balanced binary tree

■ *How to handle Collision?*

- Separate chaining
- Open addressing