

cis112

Hashing

BBBF

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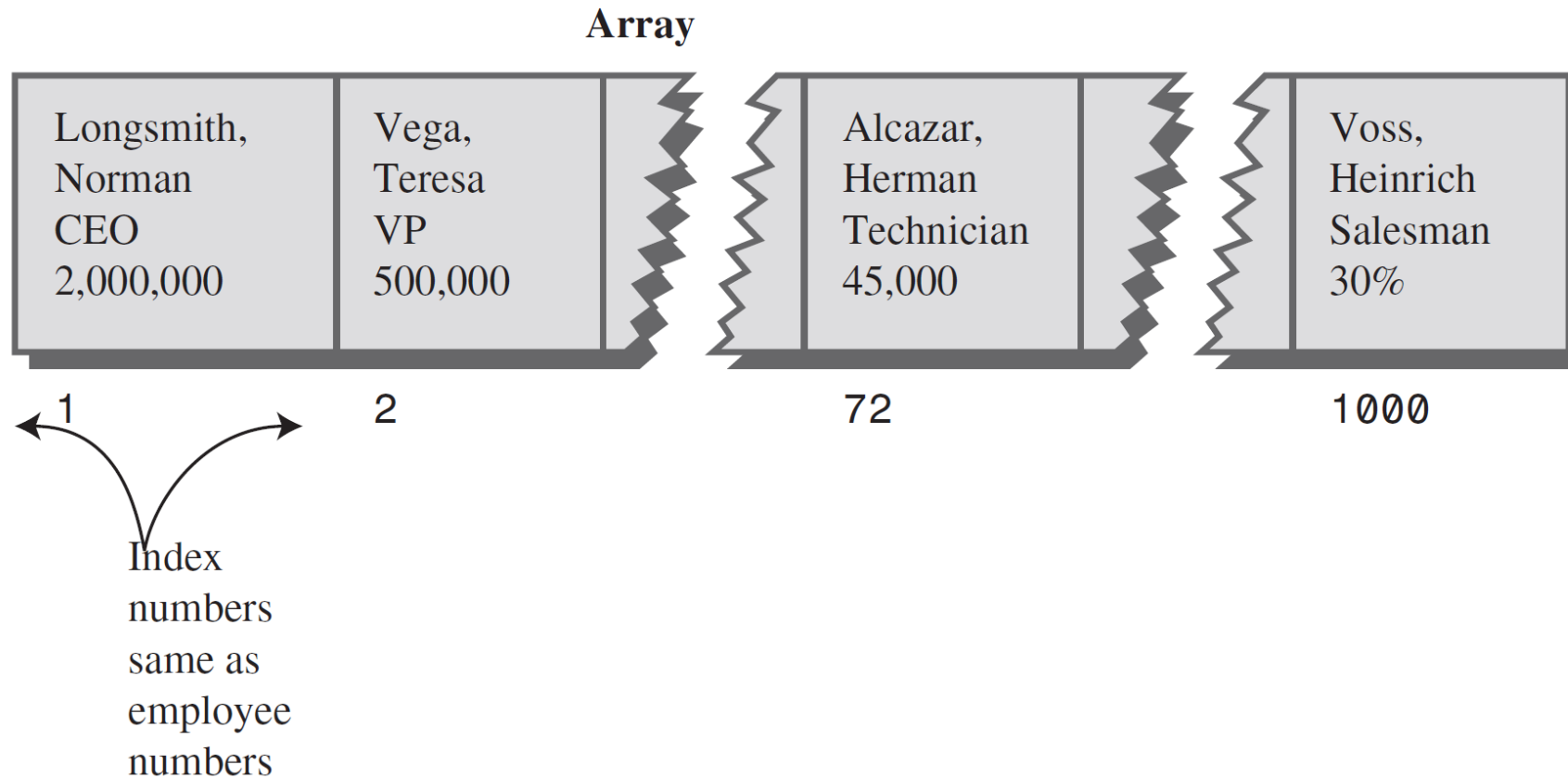
Motivation

Storing Employee Records

- Suppose you're writing a program to access employee records for a small company with, say, 1,000 employees.
- The company's personnel director has specified that she wants the fastest possible access to any individual record.
- Every employee has been given a number from 1 (for the founder) to 1,000 (for the most recently hired worker).
- These employee numbers can be used as keys to access the records.
- What sort of data structure should you use in this situation?

Storing Employee Records (cont.)

- One possibility is a simple array.



Dictionary

- Let's say we want to store a 50,000-word English-language dictionary in main memory.
- You would like every word to occupy its own cell in a 50,000-cell array, so you can access the word using an index number.
- What's the relationship of these index numbers to the words?

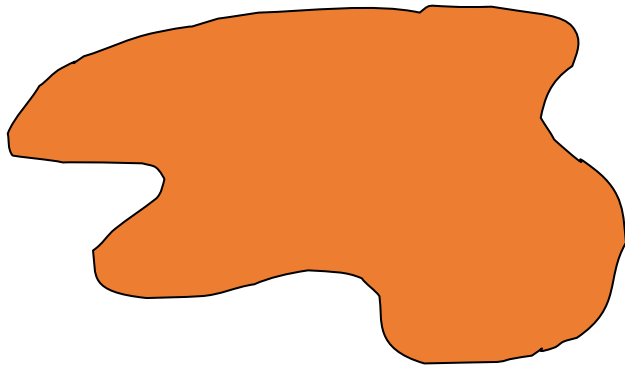
Hash Table

Hash Table

- A data structure that offers very fast insertion and searching.
 - can take close to constant time: $O(1)$
- They're based on arrays
 - arrays are difficult to expand after they've been created.
- Not suitable for sorting.
- If you don't need to visit items in order, and you can predict in advance the size of your database, hash tables are unparalleled in speed and convenience.

Hash Table (cont.)

- General idea:



K: key space (e.g., integers, strings)

hash function:

$h(K)$



hash table

0

...

TableSize - 1

Example

- key space = integers
- TableSize = 10
- $h(K) = K \bmod 10$
- **Insert:** 7, 18, 41, 94

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

Hash Table (cont.)

- Given a key k , we find the element whose key is k by just looking in the k th position of the array.
- This is called *direct addressing*.
- Direct addressing is applicable when we can afford to allocate an array with one position for every possible key.
- But if we do not have enough space to allocate a location for each possible key, then we need a mechanism to handle this case.
- Another way of defining the scenario is: if we have less locations and more possible keys, then simple array implementation is not enough.

Hash Function

Hash Function

- The hash function is used to transform the key into the index. Ideally, the hash function should map
 - Each possible key to a unique slot index, but it is difficult to achieve in practice.
- Given a collection of elements, a hash function that maps each item into a unique slot is referred to as a perfect hash function:
 1. **simple/fast** to compute,
 2. avoid **collisions**
 3. have keys distributed **evenly** among cells.

Hash Functions

- **Truncation:**
 - e.g. 123456789 map to a table of 1000 addresses by picking 3 digits of the key.
- **Folding:**
 - e.g. 123|456|789: add them and take mod.
- **Key mod N:**
 - N is the size of the table, better if it is prime.
- **Squaring:**
 - Square the key and then truncate
- **Radix conversion:**
 - e.g. 1 2 3 4 treat it to be base 11, truncate if necessary.

Folding Example

- If our element was the phone number 436-555-4601,
- we would take the digits and divide them into groups of 2 (43,65,55,46,01).
- After the addition, $43+65+55+46+01$, we get 210.
- If we assume our hash table has 11 slots, then we need to perform the extra step of dividing by 11 and keeping the remainder.
- In this case $210 \% 11$ is 1, so the phone number 436-555-4601 hashes to slot 1.

Sample Hash Functions

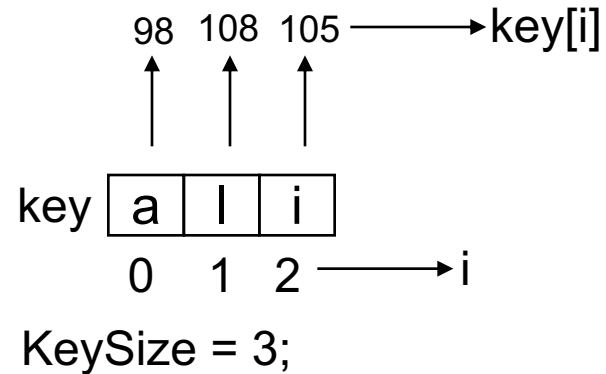
- key space = strings
- $S = s_0 s_1 s_2 \dots s_{k-1}$

1. $h(s) = s_0 \bmod \text{TableSize}$

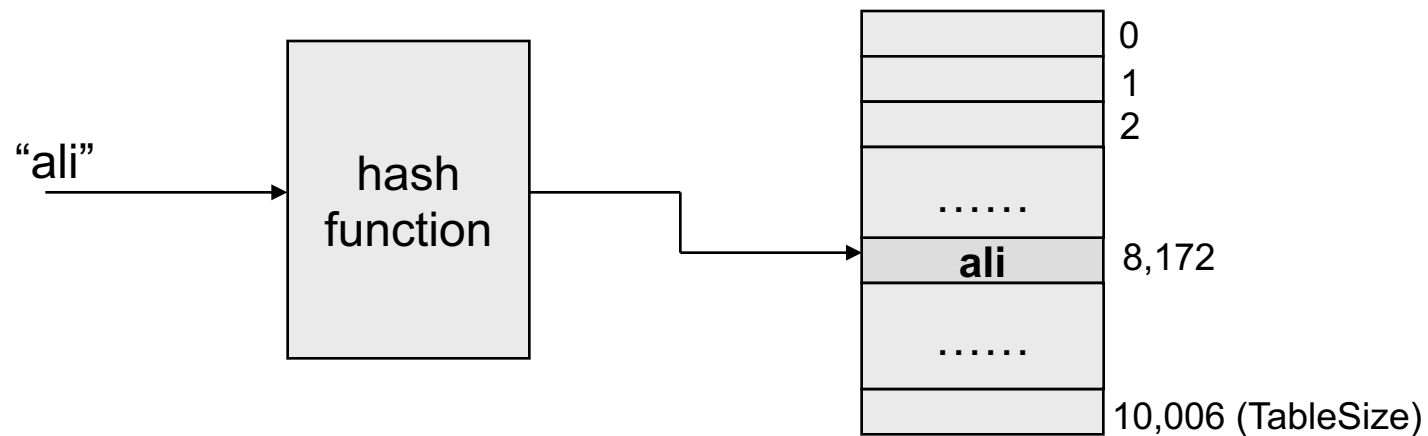
2. $h(s) = \left(\sum_{i=0}^{k-1} s_i \right) \bmod \text{TableSize}$

3. $h(s) = \left(\sum_{i=0}^{k-1} s_i \cdot 37^i \right) \bmod \text{TableSize}$

Hash function for strings:



$$\text{hash("ali")} = (105 * 1 + 108 * 37 + 98 * 37^2) \% 10,007 = 8172$$



Load Factor

- The load factor of a non-empty hash table is the number of items stored in the table divided by the size of the table.
- This is the decision parameter used when we want to rehash or expand the existing hash table entries.
- This also helps us in determining the efficiency of the hashing function.
- That means, it tells whether the hash function is distributing the keys uniformly or not.

Load Factor

- Defn: The **load factor**, λ , of a hash table is the ratio:
- Load factor: $\lambda = \frac{N}{M}$
 $N \leftarrow$ no. of elements
 $M \leftarrow$ table size
- For separate chaining,
 $\lambda =$ average # of elements in a bucket

Collision Resolution

Collision Resolution

Collision: when two keys map to the same location in the hash table.

Two ways to resolve collisions:

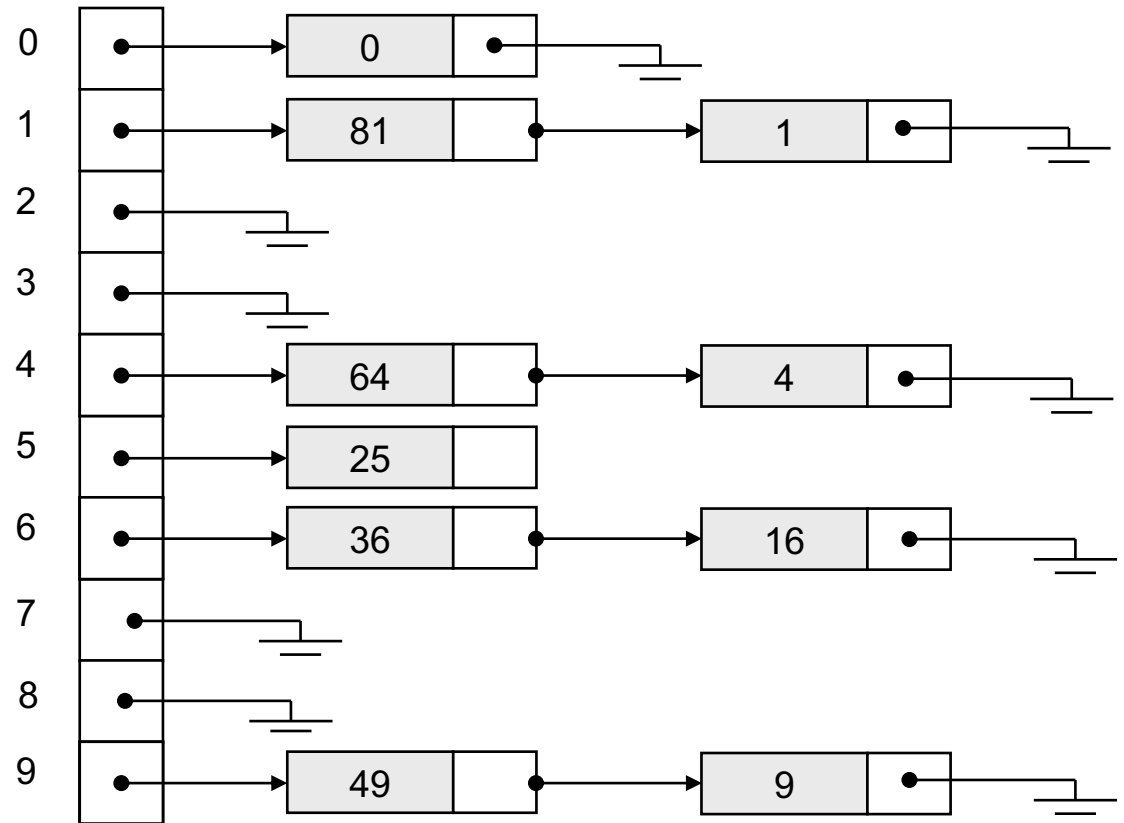
1. Separate Chaining
2. Open Addressing (linear probing, quadratic probing, double hashing)

Seperate Chaining

When two or more records hash to the same location, these records are constituted into a singly-linked list called a ***chain***.

Keys: 0, 1, 4, 9, 16, 25, 36, 49, 64, 81

$\text{hash}(\text{key}) = \text{key} \% 10.$



tableSize: Why Prime?

- Suppose that data stored in hash table:
7160, 493, 60, 55, 321, 900, 810
 - tableSize = 10
data hashes to 0, 3, 0, 5, 1, 0, 0
 - tableSize = 11
data hashes to 10, 9, 5, 0, 2, 9, 7

Operations

- **Initialization:** all entries are set to NULL
- **Find:**
 - locate the cell using hash function.
 - sequential search on the linked list in that cell.
- **Insertion:**
 - Locate the cell using hash function.
 - (If the item does not exist) insert it as the first item in the list.
- **Deletion:**
 - Locate the cell using hash function.
 - Delete the item from the linked list.

Open Addressing and Probing

Open Addressing

- In open addressing all keys are stored in the hash table itself.
- This procedure is based on **probing**.
 - A collision is resolved by probing.

Linear Probing

- The interval between probes is fixed at 1.
- In linear probing, we search the hash table sequentially, starting from the original hash location.
- If a location is occupied, we check the **next** location.
- We wrap around from the last table location to the first table location if necessary. The function for rehashing is the following:

$$\mathbf{rehash(key) = (n + 1) \% tablesize}$$

Example

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

Insert:

38

19

8

109

10

- **Linear Probing**: after checking spot $h(k)$, try spot $h(k)+1$, if that is full, try $h(k)+2$, then $h(k)+3$, etc.

Linear Probing

$$f(i) = i$$

- Probe sequence:

0th probe = $h(k) \bmod \text{TableSize}$

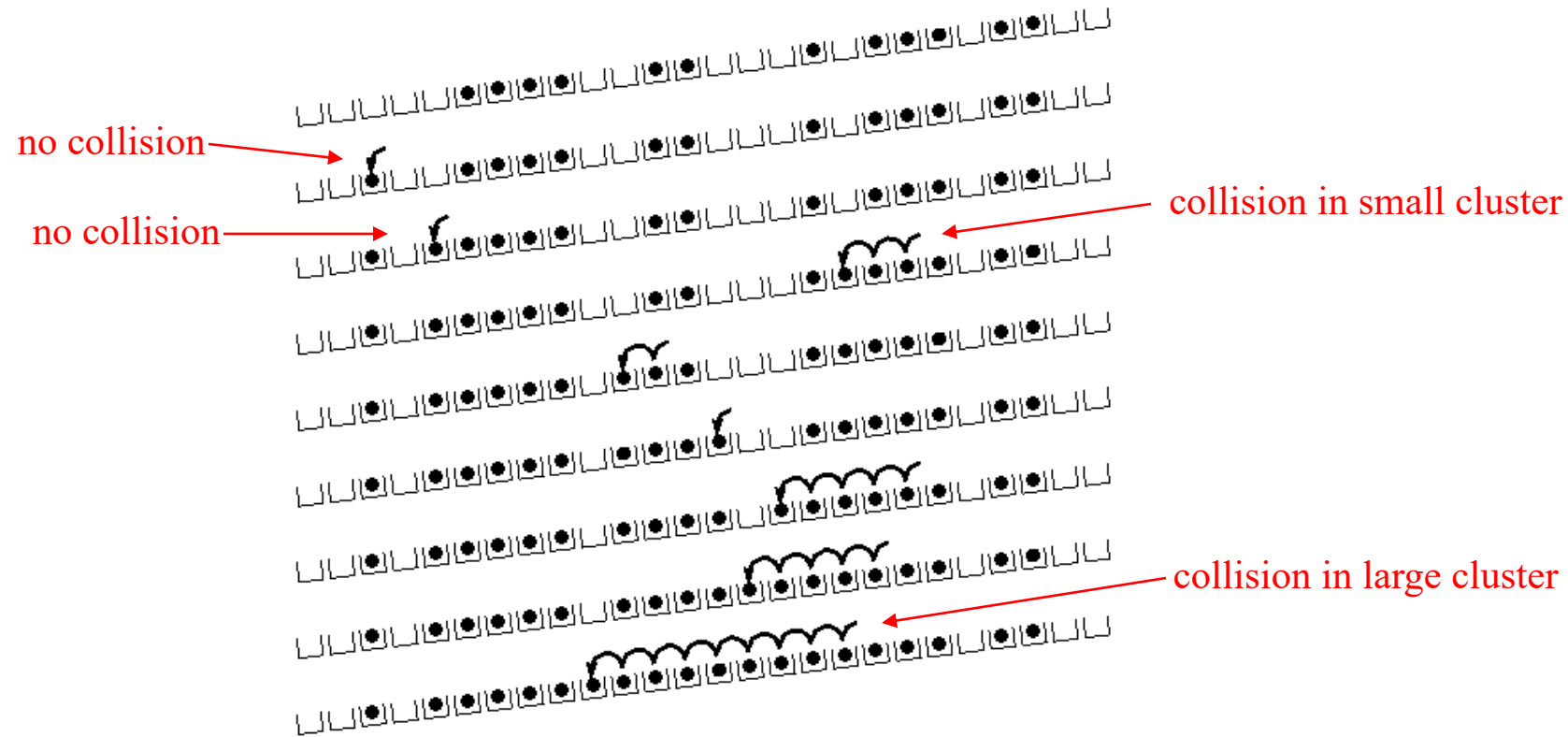
1th probe = $(h(k) + 1) \bmod \text{TableSize}$

2th probe = $(h(k) + 2) \bmod \text{TableSize}$

...

i^{th} probe = $(h(k) + i) \bmod \text{TableSize}$

Linear Probing – Clustering



[R. Sedgewick]

Load Factor in Linear Probing

- For *any* $\lambda < 1$, linear probing *will* find an empty slot
- Expected # of probes (for large table sizes)
 - successful search: $\frac{1}{2} \left(1 + \frac{1}{(1-\lambda)} \right)$
 - unsuccessful search: $\frac{1}{2} \left(1 + \frac{1}{(1-\lambda)^2} \right)$
- Linear probing suffers from **primary clustering**
- Performance quickly degrades for $\lambda > 1/2$

Quadratic Probing

$$f(i) = i^2$$

- Probe sequence:

0th probe = $h(k) \bmod \text{TableSize}$

1th probe = $(h(k) + 1) \bmod \text{TableSize}$

2th probe = $(h(k) + 4) \bmod \text{TableSize}$

3th probe = $(h(k) + 9) \bmod \text{TableSize}$

...

i^{th} probe = $(h(k) + i^2) \bmod \text{TableSize}$

Less likely to
encounter
Primary
Clustering

Quadratic Probing

- The interval between probes increases proportionally to the hash value (the interval thus increasing linearly, and the indices are described by a quadratic function).
- The problem of clustering can be eliminated if we use the quadratic probing method.
- In quadratic probing, we start from the original hash location i .
- If a location is occupied, we check the locations $i + 1^2$, $i + 2^2$, $i + 3^2$, $i + 4^2$...
- We wrap around from the last table location to the first table location if necessary. The function for rehashing is the following:

$$\text{rehash}(\text{key}) = (\mathbf{n} + \mathbf{k}^2) \% \text{tablesize}$$

Quadratic Probing

0	
1	
2	2
3	13
4	25
5	5
6	24
7	9
8	19
9	31
10	21

$$31 \bmod 11 = 9$$

$$19 \bmod 11 = 8$$

$$2 \bmod 11 = 2$$

$$13 \bmod 11 = 2 \rightarrow 2 + 1^2 = 3$$

$$25 \bmod 11 = 3 \rightarrow 3 + 1^2 = 4$$

$$24 \bmod 11 = 2 \rightarrow 2 + 1^2, 2 + 2^2 = 6$$

$$21 \bmod 11 = 10$$

$$9 \bmod 11 = 9 \rightarrow 9 + 1^2, 9 + 2^2 \bmod 11, 9 + 3^2 \bmod 11 = 7$$

Quadratic Probing Example

insert(**76**)

$$76 \% 7 = 6$$

insert(**40**)

$$40 \% 7 = 5$$

insert(**48**)

$$48 \% 7 = 6$$

insert(**5**)

$$5 \% 7 = 5$$

insert(**55**)

$$55 \% 7 = 6$$

0	
1	
2	
3	
4	
5	
6	76

But... insert(**47**)
 $47 \% 7 = 5$

Quadratic Probing

- Problem:
 - We may not be sure that we will probe all locations in the table (i.e. there is no guarantee to find an empty cell if table is more than half full.)
 - If the hash table size is not prime this problem will be much severe.
- However, there is a theorem stating that:
 - If the table size is *prime* and load factor is not larger than 0.5, all probes will (guarantee) be to different locations and an item can always be inserted.

Quadratic Probing: Properties

- For *any* $\lambda < \frac{1}{2}$, quadratic probing will find an empty slot; for bigger λ , quadratic probing *may* find a slot
- Quadratic probing does not suffer from *primary* clustering: keys hashing to the same *area* are not bad
- But what about keys that hash to the same *spot*?
 - ***Secondary Clustering!***

Double Hashing

$$f(i) = i * g(k)$$

where g is a second hash function

- Probe sequence:

$$0^{\text{th}} \text{ probe} = h(k) \bmod \text{TableSize}$$

$$1^{\text{th}} \text{ probe} = (h(k) + g(k)) \bmod \text{TableSize}$$

$$2^{\text{th}} \text{ probe} = (h(k) + 2 * g(k)) \bmod \text{TableSize}$$

$$3^{\text{th}} \text{ probe} = (h(k) + 3 * g(k)) \bmod \text{TableSize}$$

...

$$i^{\text{th}} \text{ probe} = (h(\underline{k}) + i * g(\underline{k})) \bmod \text{TableSize}$$

Double Hashing Example

$$h(k) = k \bmod 7 \text{ and } g(k) = 5 - (k \bmod 5)$$

	76	93	40	47	10	55
0						
1				47	47	47
2		93	93	93	93	93
3					10	10
4						55
5			40	40	40	40
6	76	76	76	76	76	76
Probes	1	1	1	2	1	2

Resolving Collisions with Double Hashing

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

Hash Functions:

$$H(K) = K \bmod M$$

$$H_2(K) = 1 + ((K/M) \bmod (M-1))$$

$M =$

Insert these values into the hash table in this order. Resolve any collisions with double hashing:

13

28

33

147

43

Rehashing

Idea: When the table gets too full, create a bigger table (usually 2x as large) and hash all the items from the original table into the new table.

- When to rehash?
 - half full ($\lambda = 0.5$)
 - when an insertion fails
 - some other threshold
- Cost of rehashing?

Implementation

Separate Chaining

```
public class Link { // (could be other items)
    public int iData; // data item
    public Link next; // next link in list
//-----

    public Link(int it) // constructor
    {
        iData = it;
    }
}
```

```
public class HashTable {
    private SortedList[] hashArray; // array of lists
    private int arraySize;

//-----|-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new SortedList[arraySize]; // create array
        for (int j = 0; j < arraySize; j++) // fill array
            hashArray[j] = new SortedList(); // with empty lists
    }

    public void insert(Link theLink) // insert a link
    {
        int key = theLink.iData;
        int hashVal = hashFunc(key); // hash the key
        hashArray[hashVal].insert(theLink); // insert at hashVal
    } // end insert()
//-----

    public void delete(int key) // delete a link
    {
        int hashVal = hashFunc(key); // hash the key
        hashArray[hashVal].delete(key); // delete link
    } // end delete()
//-----

    public Link find(int key) // find link
    {
        int hashVal = hashFunc(key); // hash the key
        Link theLink = hashArray[hashVal].find(key); // get link
        return theLink; // return link
    }
}
```

Linear Probing - insert

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public void insert(DataItem item) // insert a DataItem
    (assumes table not full)
    {
        int key = item.getKey(); // extract key
        int hashVal = hashFunc(key); // hash the key
        while (hashArray[hashVal] != null && hashArray[hashVal].getKey() != -1) {
            ++hashVal; // go to next cell
            hashVal %= arraySize; // wraparound if necessary
        }
        hashArray[hashVal] = item; // insert item
    } // end insert()
}

public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    public int getKey() {
        return iData;
    }
} // end class DataItem
```

Linear Probing - delete

```
public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    //-----
    public int getKey() {
        return iData;
    }
    //-----
} // end class DataItem
```

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public DataItem delete(int key) // delete a DataItem
    {
        int hashVal = hashFunc(key); // hash the key
        while (hashArray[hashVal] != null) // until empty cell,
        { // found the key?
            if (hashArray[hashVal].getKey() == key) {
                DataItem temp = hashArray[hashVal]; // save item
                hashArray[hashVal] = nonItem; // delete item
                return temp; // return item
            }
            ++hashVal; // go to next cell
            hashVal %= arraySize; // wraparound if necessary
        }
        return null; // can't find item
    } // end delete()
}
```

Linear Probing - finding

```
public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    //-----
    public int getKey() {
        return iData;
    }
    //-----
} // end class DataItem
```

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public DataItem find(int key) // find item with key
    {
        int hashVal = hashFunc(key); // hash the key
        while (hashArray[hashVal] != null) // until empty cell,
        { // found the key?
            if (hashArray[hashVal].getKey() == key)
                return hashArray[hashVal]; // yes, return item
            ++hashVal; // go to next cell
            hashVal %= arraySize; // wraparound if necessary
        }
        return null; // can't find item
    }
}
```

Double Hashing - insert

```
public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    //-----

    public int getKey() {
        return iData;
    }

    //-----
} // end class DataItem
```

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public int hashFunc2(int key) {
        // non-zero, less than array size, different from hF1
        // array size must be relatively prime to 5, 4, 3, and 2
        return 5 - key % 5;
    }

    public void insert(int key, DataItem item)
    (assumes table not full)
    {
        int hashVal = hashFunc1(key); // hash the key
        int stepSize = hashFunc2(key); // get step size
        // until empty cell or -1
        while (hashArray[hashVal] != null && hashArray[hashVal].iData != -1) {
            hashVal += stepSize; // add the step
            hashVal %= arraySize; // for wraparound
        }
        hashArray[hashVal] = item; // insert item
    } // end insert()
}
```

Double Hashing -delete

```
public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    //-----
    public int getKey() {
        return iData;
    }
    //-----
} // end class DataItem

public DataItem delete(int key) // delete a DataItem
{
    int hashVal = hashFunc1(key); // hash the key
    int stepSize = hashFunc2(key); // get step size

    while (hashArray[hashVal] != null) // until empty cell,
    { // is correct hashVal?
        if (hashArray[hashVal].iData == key) {
            DataItem temp = hashArray[hashVal]; // save item
            hashArray[hashVal] = nonItem; // delete item
            return temp; // return item
        }
        hashVal += stepSize; // add the step
        hashVal %= arraySize; // for wraparound
    }
    return null; // can't find item
} // end delete()
```

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public int hashFunc2(int key) {
        // non-zero, less than array size, different from hF1
        // array size must be relatively prime to 5, 4, 3, and 2
        return 5 - key % 5;
    }
}
```


Double Hashing -find

```
public class DataItem { // (could have more data)
    private int iData; // data item (key)
    //-----

    public DataItem(int ii) // constructor
    {
        iData = ii;
    }

    //-----
    public int getKey() {
        return iData;
    }
    //-----
} // end class DataItem

public DataItem find(int key) // find item with key
(assumes table not full)
{
    int hashVal = hashFunc1(key); // hash the key
    int stepSize = hashFunc2(key); // get step size

    while (hashArray[hashVal] != null) // until empty cell,
    { // is correct hashVal?
        if (hashArray[hashVal].iData == key)
            return hashArray[hashVal]; // yes, return item
        hashVal += stepSize; // add the step
        hashVal %= arraySize; // for wraparound
    }
    return null; // can't find item
}
```

```
public class HashTable {
    private DataItem[] hashArray; // array holds hash table
    private int arraySize;

    private DataItem nonItem; // for deleted items
    //-----

    public HashTable(int size) // constructor
    {
        arraySize = size;
        hashArray = new DataItem[arraySize];
        nonItem = new DataItem(-1); // deleted item key is -1
    }

    public int hashFunc2(int key) {
        // non-zero, less than array size, different from hF1
        // array size must be relatively prime to 5, 4, 3, and 2
        return 5 - key % 5;
    }
}
```

References

- [1] R. Lafore, Data Structures & Algorithms in Java, 2nd edition, SAMS.
- [2] T. H. Cormen, C. E. Leiserson, R. L. Rivest, and C. Stein, Introduction to Algorithms. MIT Press, 2022. (CLRS)