

Hash Table

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Hash Function

A hash function $h(k)$ is a function that maps the key k to a fixed range.

- For example, $h(k) = k \bmod 11$ maps integer keys to the range $\{0, 1, 2, \dots, 10\}$.
- $h(20) = 20 \bmod 11 = 9$.

Hash Function

A hash function $h(k)$ is a function that maps the key k to a fixed range.

- Hash function can map strings to integers.
- For example, $h(\text{"ABC"}) = (65 + 66 + 67) \bmod 53 = 39$.

Hash Function

A hash function $h(k)$ is a function that maps the key k to a fixed range.

- Hash function can map strings to integers.
- For example, $h(\text{"ABC"}) = (65 + 66 + 67) \bmod 53 = 39$.

```
int h(char key[], int length) {  
    sum = 0;  
    for (i=0; i<length; i++)  
        sum += key[i];  
    return sum % 53;  
    // divisor should be a prime  
}
```

```
ASCII('A') = 65  
ASCII('B') = 66  
    ...  
ASCII('Z') = 90
```

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

• This is called a **key-value pair**.

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

- **Keys** must be unique.

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

- Values may not be unique.

Hash Table

		Key (name)	Value (phone)
Indices	0		
	1	Willian	5013892745
	2	John	2012636901
	3		
	4	Cindy	9732502971
	5	James	5512636588
	6		

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

- The hash table has n rows.
- Hash function h maps keys to indices in $\{0, 1, 2, \dots, n - 1\}$.
- E.g., $h(\text{"James"}) = 5$.

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

Insertion

- Given a key-value pair (k, v) .
- Compute $i = h(k)$.
- Insert (k, v) to the i -th row.

Hash Table

	Key (name)	Value (phone)
0		
1	Willian	5013892745
2	John	2012636901
3		
4	Cindy	9732502971
5	James	5512636588
6		

Search

- Given a key k .
- Compute $i = h(k)$.
- Go to the i -th row to find the key and value.

Hash Collision

Hash Collision

- If $k_1 = k_2$, then $h(k_1) = h(k_2)$.
- However, $h(k_1) = h(k_2)$ does not guarantee $k_1 = k_2$.

Hash Collision

- If $k_1 = k_2$, then $h(k_1) = h(k_2)$.
- However, $h(k_1) = h(k_2)$ does not guarantee $k_1 = k_2$.
- Example:
 - $h(k) = k \bmod 11$.
 - $k_1 = 25$ and $k_2 = 3$.
 - $h(k_1) = h(k_2) = 3 \rightarrow$ Hash collision!

Hash Collision

- If $k_1 = k_2$, then $h(k_1) = h(k_2)$.
- However, $h(k_1) = h(k_2)$ does not guarantee $k_1 = k_2$.
- Example:
 - $h(k) = k \bmod 11$.
 - $k_1 = 25$ and $k_2 = 3$.
 - $h(k_1) = h(k_2) = 3 \rightarrow$ Hash collision!

Hash collision: $k_1 \neq k_2$, but $h(k_1) = h(k_2)$.

Hash Collision

	Key	Value
0		
1		
2		
3		
4		
5		
6		
7		
8		
9		

- Keys are integers; values are strings.
- $h(k) = (k^2 + 3) \bmod 10$.
- We are inserting key-values pairs to the table.

Hash Collision

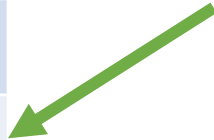
	Key	Value
0		
1		
2	3	James
3		
4		
5		
6		
7		
8		
9		

- To insert $(3, \text{"James"})$.
- $h(3) = (3^2 + 3) \bmod 10 = 2$.
- Insert $(3, \text{"James"})$ to the 2nd row.

Hash Collision

	Key	Value
0		
1		
2	3	James
3		
4		
5		
6		
7	32	Mary
8		
9		

- To insert $(32, \text{"Mary"})$.
- $h(32) = (32^2 + 3) \bmod 10 = 7$.
- Insert $(32, \text{"Mary"})$ to the 7th row.



Hash Collision

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9		

- To insert (1, "Michael").
- $h(1) = (1^2 + 3) \bmod 10 = 4$.
- Insert (1, "Michael") to the 4th row.

Hash Collision

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9		

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row.

 **Collision!**

Solutions

- **Separate chaining:** One row can store multiple key-value pairs (using a linked list).
- **Linear probing:** Use the next vacant row.
- **Quadratic probing:** Jump to some vacant row.

Separate Chaining

Insertion

	Key	Value	
0			
1			
2	3	James	
3			
4	1	Michael	
5			
6			
7	32	Mary	
8			
9			

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row.

Collision!



Insertion

	Key	Value	
0			
1			
2	3	James	
3			
4	1	Michael	
5			
6			
7	32	Mary	
8			
9			

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row.



~ (2, Larry)

Insertion

	Key	Value	
0			
1			
2	3	James	
3			
4	1	Michael	
5			
6			
7	32	Mary	↪ (2, Larry)
8			
9			


- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row.

Collision!

Insertion

- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row.

	Key	Value	
0			
1			
2	3	James	
3			
4	1	Michael	
5			
6			
7	32	Mary	\rightsquigarrow (2, Larry) \rightsquigarrow (8, Bill)
8			
9			



Search

- To search **key = 2**.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Search **key = 2** in the 7th row.

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9		

Do not match!

~ (2, Larry) ~ (8, Bill)

Search

	Key	Value	
0			
1			
2	3	James	
3			
4	1	Michael	
5			
6			
7	32	Mary	
8			
9			

- To search **key = 2**.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Search **key = 2** in the 7th row.
- Go to the linked list to search **key = 2**.

Found!

~ (2, Larry) ~ (8, Bill)

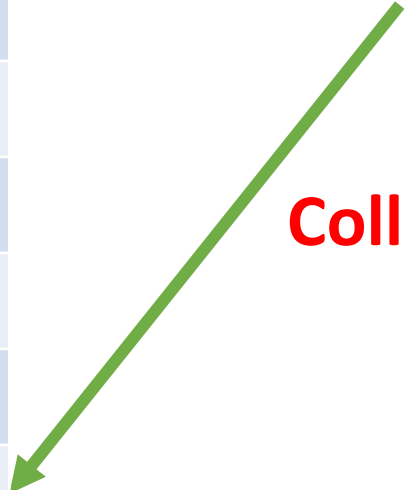
Linear Probing

Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9	6	Cindy

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row.

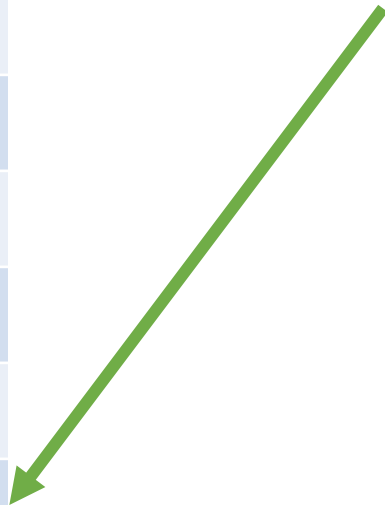
Collision!



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9	6	Cindy

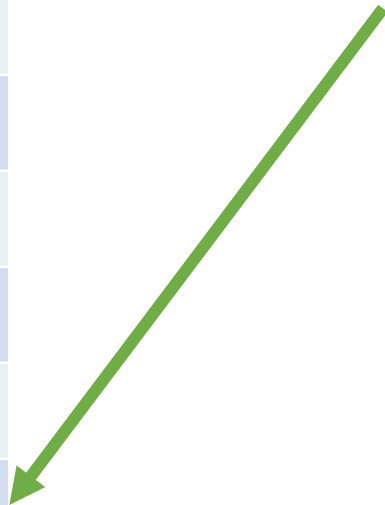
- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row. (Fail.)
- Try the 8th row (which is empty.)



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row. (Fail.)
- Try the 8th row (which is empty.)
- Insert $(2, \text{"Larry"})$ to the 8th row.

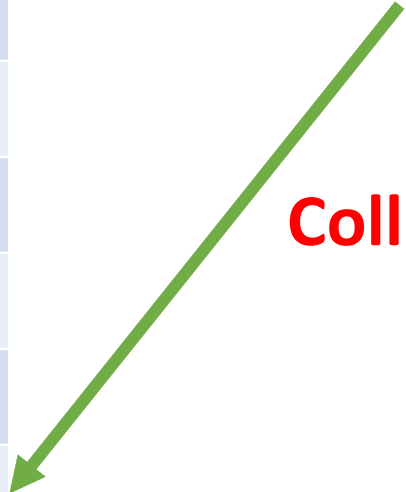


Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row.

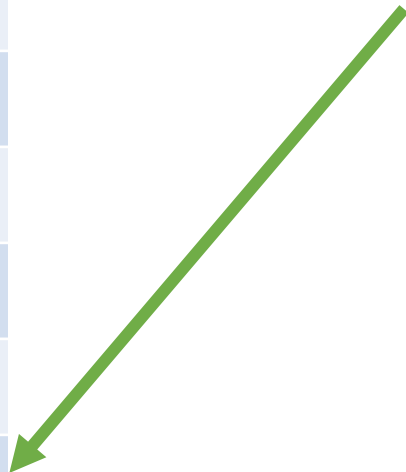
Collision!



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

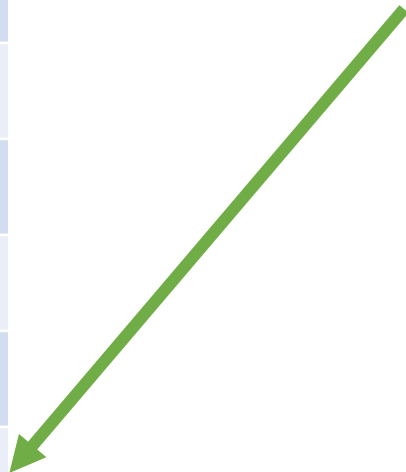
- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Try the 8th row.



Insertion

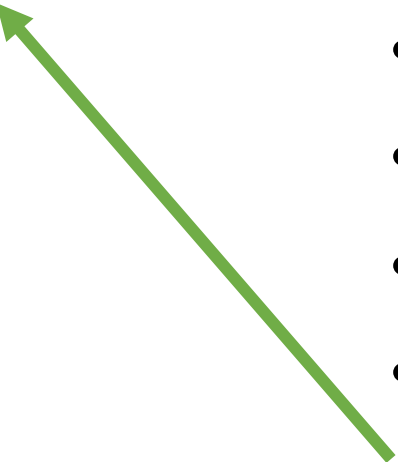
	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Try the 8th row. (Fail.)
- Try the 9th row.



Insertion

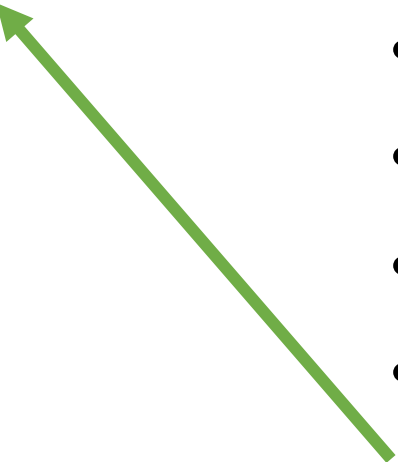
	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Try the 8th row. (Fail.)
- Try the 9th row. (Fail.)
- Try the 0th row (which is empty.)

Insertion

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

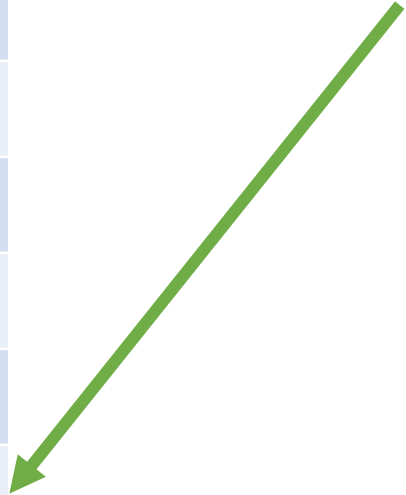


- To insert $(8, \text{"Bill"})$.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Try the 8th row. (Fail.)
- Try the 9th row. (Fail.)
- Try the 0th row (which is empty.)
- Insert $(8, \text{"Bill"})$ to the 0th row.

Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

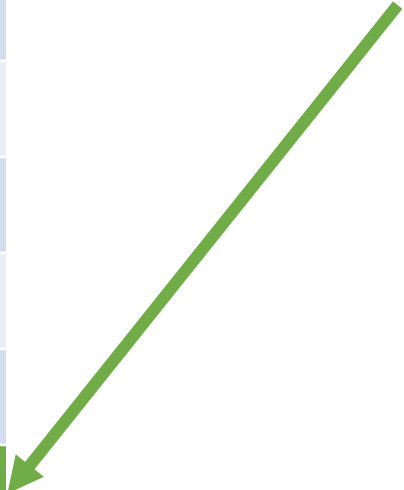
- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row.



Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

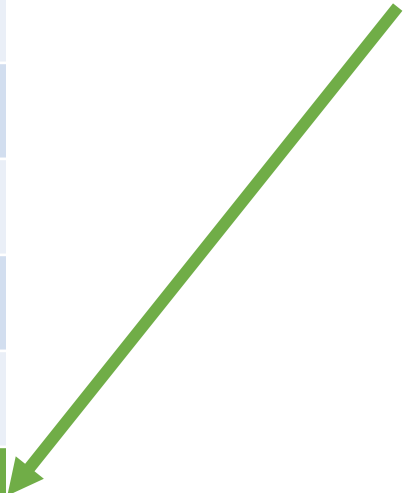
- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)



Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

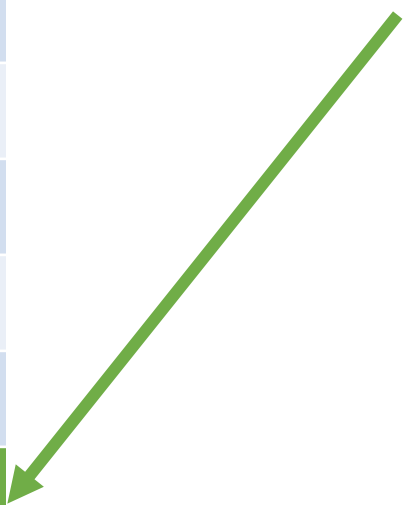
- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)
- Look for **key = 8** in the 8th row. (Not found.)



Search

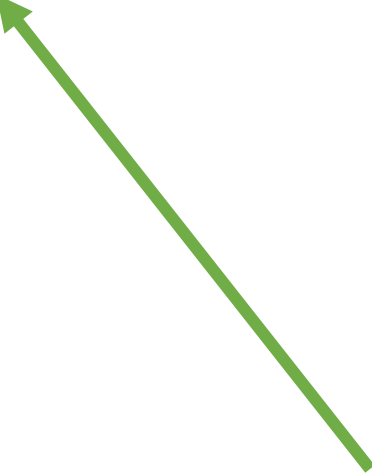
	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)
- Look for **key = 8** in the 8th row. (Not found.)
- Look for **key = 8** in the 9th row. (Not found.)



Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

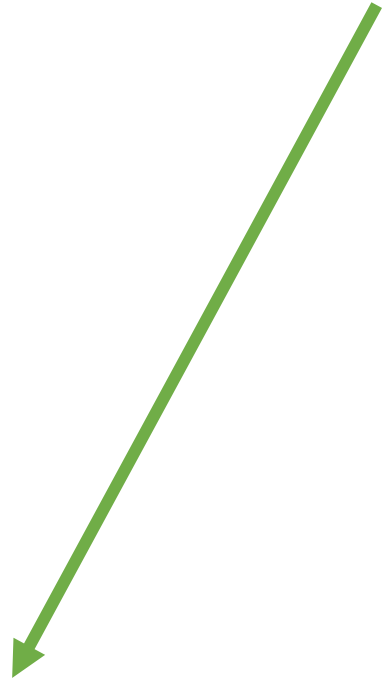


- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)
- Look for **key = 8** in the 8th row. (Not found.)
- Look for **key = 8** in the 9th row. (Not found.)
- Look for **key = 8** in the 0th row. (Found!)

Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

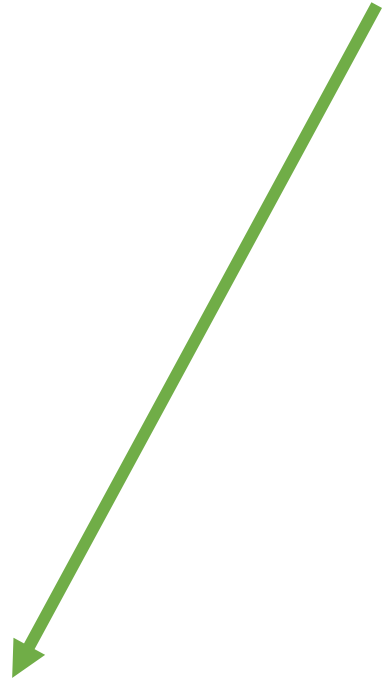
- To search **key = 4**.
- $h(4) = (4^2 + 3) \bmod 10 = 9$.
- Look for **key = 4** in the 9th row.



Search

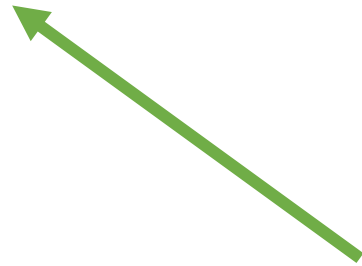
	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To search **key = 4**.
- $h(4) = (4^2 + 3) \bmod 10 = 9$.
- Look for **key = 4** in the 9th row. (Not found.)



Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

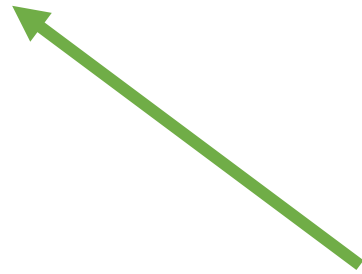


- To search **key = 4**.
- $h(4) = (4^2 + 3) \bmod 10 = 9$.
- Look for **key = 4** in the 9th row. (Not found.)
- Look for **key = 4** in the 0th row. (Not found.)

Search

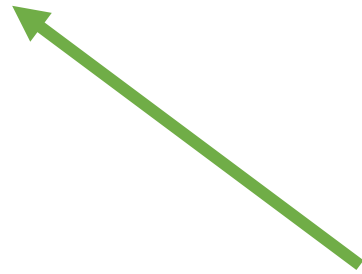
	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To search **key = 4**.
- $h(4) = (4^2 + 3) \bmod 10 = 9$.
- Look for **key = 4** in the 9th row. (Not found.)
- Look for **key = 4** in the 0th row. (Not found.)
- Look for **key = 4** in the 1st row. (Not found.)



Search

	Key	Value
0	8	Bill
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To search **key = 4**.
- $h(4) = (4^2 + 3) \bmod 10 = 9$.
- Look for **key = 4** in the 9th row. (Not found.)
- Look for **key = 4** in the 0th row. (Not found.)
- Look for **key = 4** in the 1st row. (Not found.)

key = 4 is not in the table!

Quadratic Probing

Quadratic Probing

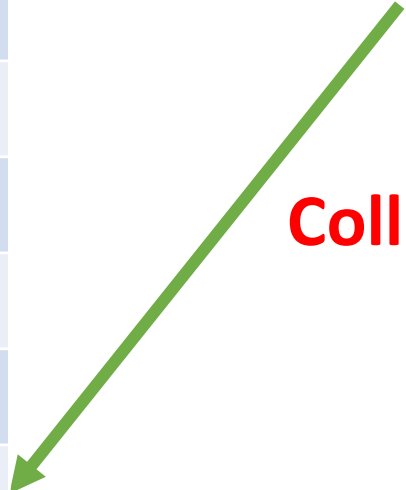
- If $h(k)$ causes a collision, then look for an empty row.
- For $i = 1, 2, 3, \dots$, try the rows
 $(h(k) + i^2) \bmod \text{TableSize}$.
- Place the key-value pair in the first vacant cell.

Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9	6	Cindy

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row.

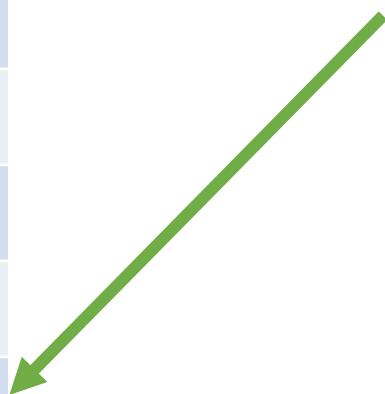
Collision!



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8		
9	6	Cindy

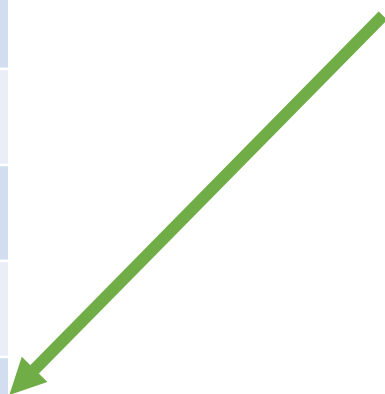
- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row. (Fail.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Try the 8th row.



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To insert $(2, \text{"Larry"})$.
- $h(2) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(2, \text{"Larry"})$ to the 7th row. (Fail.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Try the 8th row.

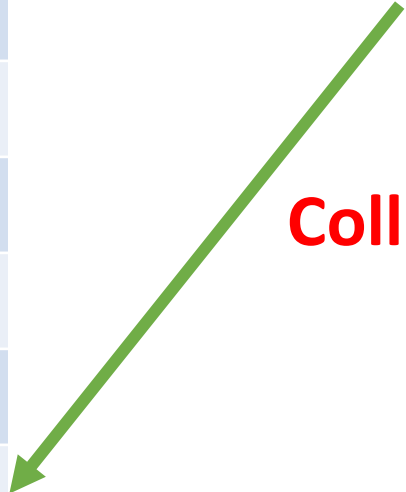


Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To insert $(8, \text{"Bill"})$.
- $h(8) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row.

Collision!



Insertion

	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

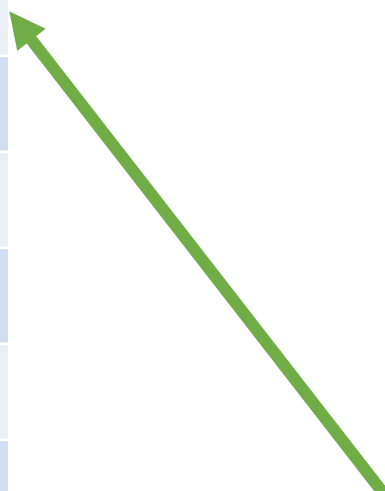
- To insert $(8, \text{"Bill"})$.
- $h(8) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Try the 8th row.

Collision!



Insertion

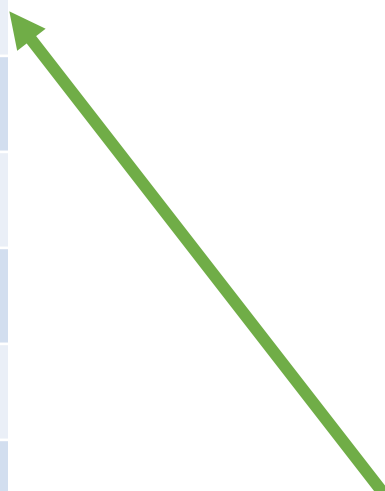
	Key	Value
0		
1		
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To insert $(8, \text{"Bill"})$.
- $h(8) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Try the 8th row.
- Quadratic probing: $(7 + 2^2) \bmod 10 = 1$.
- Try the 1st row.

Insertion

	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To insert $(8, \text{"Bill"})$.
- $h(8) = (2^2 + 3) \bmod 10 = 7$.
- Insert $(8, \text{"Bill"})$ to the 7th row. (Fail.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Try the 8th row.
- Quadratic probing: $(7 + 2^2) \bmod 10 = 1$.
- Try the 1st row.

Search

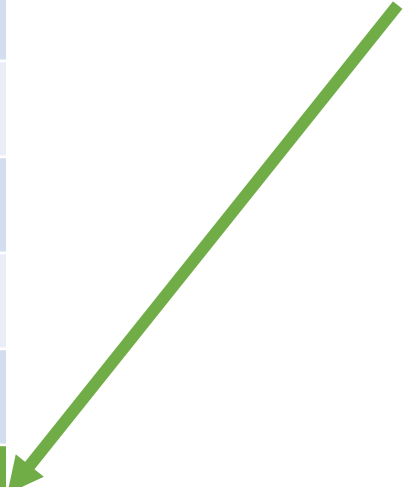
- To search **key = 8**.

	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

Search

	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

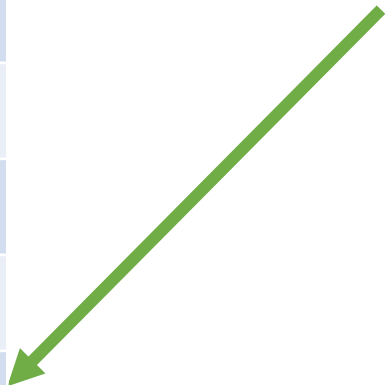
- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)



Search

	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

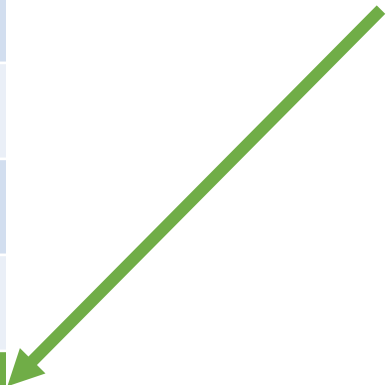
- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)
- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Look for **key = 8** in the 8th row.



Search

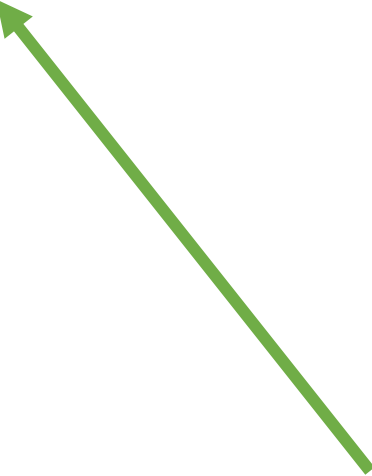
	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy

- To search **key = 8**.
- $h(8) = (8^2 + 3) \bmod 10 = 7$.
- Look for **key = 8** in the 7th row. (Not found.)
- Quadratic probing: **$(7 + 1^2) \bmod 10 = 8$** .
- Look for **key = 8** in the 8th row. (Not found.)



Search

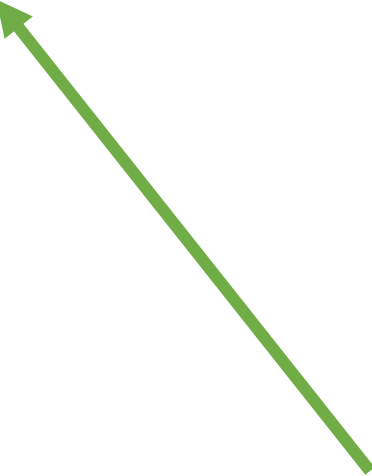
	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To search **key = 8**.
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- Look for **key = 8** in the 8th row. (Not found.)
- Quadratic probing: $(7 + 2^2) \bmod 10 = 1$.
- Look for **key = 8** in the 1st row.

Search

	Key	Value
0		
1	8	Bill
2	3	James
3		
4	1	Michael
5		
6		
7	32	Mary
8	2	Larry
9	6	Cindy



- To search **key = 8**.
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- Quadratic probing: $(7 + 1^2) \bmod 10 = 8$.
- Look for **key = 8** in the 8th row. (Not found.)
- Quadratic probing: $(7 + 2^2) \bmod 10 = 1$.
- Look for **key = 8** in the 1st row.

Questions

Insertion

	Key	Value
0	8	Bill
1	3	James
2		
3	1	Michael
4	32	Mary
5		
6	2	Larry
7		
8	6	Cindy
9		
10		

- Hash function:

$$h(k) = (k^2 + 2) \bmod 11.$$

- **Q1:** Where to insert (12, Chelsea) if linear probing is used?
- **Q2:** Where to insert (12, Chelsea) if quadratic probing is used?

Thank You!