

CSE 332

JULY 10TH – HASHING

EXAM FRIDAY

- **Practice exam after class today**
- **Topics:**
 - Stacks and Queues
 - BigO Notation and runtime Analysis
 - Heaps
 - Trees (BST and AVL)
 - Design Tradeoffs

EXAM FRIDAY

- **Format**

EXAM FRIDAY

- **Format**
 - No note sheet

EXAM FRIDAY

- **Format**
 - No note sheet
 - One section of short answer

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 - 4-5 Technical Questions

EXAM FRIDAY

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 - 4-5 Technical Questions
 - 1 Design Decision Question

EXAM FRIDAY

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- One section of short answer
- 4-5 Technical Questions
- 1 Design Decision Question
- Less than 10 minutes per problem

EXAM FRIDAY

- **No Java material on the exam**

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- **Looking for theoretical understanding**

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- **Any questions?**

TODAY'S LECTURE

- Hashing

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- Hashing
 - Basic Concept

TODAY'S LECTURE

- **Hashing**
 - Basic Concept
 - Hash functions

TODAY'S LECTURE

- **Hashing**
 - Basic Concept
 - Hash functions
 - Collision Resolution

TODAY'S LECTURE

- **Hashing**
 - Basic Concept
 - Hash functions
 - Collision Resolution
 - Runtimes

HASHING

- **Introduction**

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- Suppose there is a set of data **M**

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HASHING

- **Introduction**

- Suppose there is a set of data **M**
- Any data we might want to store is a member of this set. For example, **M** might be the set of all strings
- There is a set of data that we actually care about storing **D**, where **D** \ll **M**
- For an English Dictionary, **D** might be the set of English words

HASHING

- What is our ideal data structure?

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 - The data structure should use $O(D)$ memory
 - No extra memory is allocated
 - The operation should run in $O(1)$ time
 - Accesses should be as fast as possible

HASHING

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 - Need to know the size of **D** in advance or lose memory to pointer overhead

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- **What are some difficulties with this?**
 - Need to know the size of **D** in advance or lose memory to pointer overhead
 - Hard to go from **M** \rightarrow **D** in $O(1)$ time

HASHING

- **Memory: The Hash Table**

HASHING

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 - Consider an array of size $c * D$

HASHING

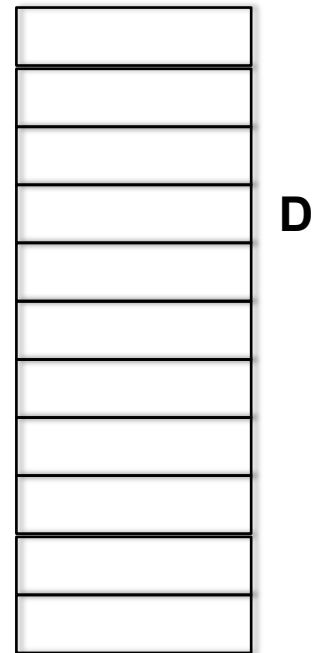
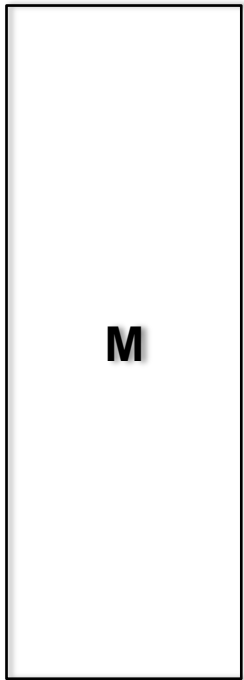
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HASHING

- **Memory: The Hash Table**
 - Consider an array of size $c * D$
 - Each index in the array corresponds to *some* element in **M** that we want to store.
 - The data in **D** does not need any particular ordering.

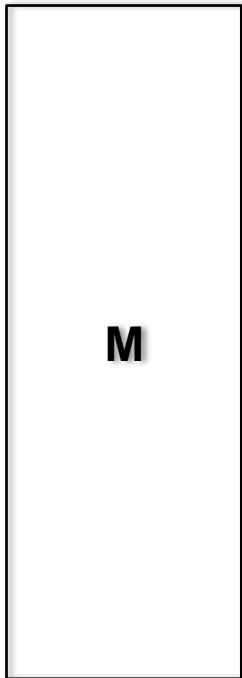
THE HASH TABLE

- How can we do this?



THE HASH TABLE

- How can we do this?
 - Unsorted Array

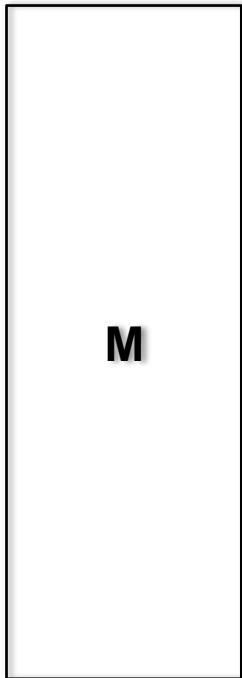


Apple	D
Pear	
Orange	
Durian	

A vertical stack of 12 rectangular cells. The first four cells contain the words 'Apple', 'Pear', 'Orange', and 'Durian' respectively. To the right of these four cells is a bold letter 'D'. The remaining eight cells are empty.

THE HASH TABLE

- What is the problem here?

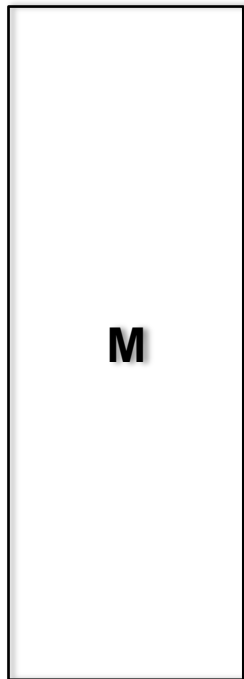


Apple	D
Pear	
Orange	
Durian	
Kumquat	

A vertical stack of 11 rectangular cells. The first five cells contain the words 'Apple', 'Pear', 'Orange', 'Durian', and 'Kumquat' from top to bottom. The remaining six cells are empty. To the right of the stack, the letter 'D' is positioned between the 'Durian' and 'Kumquat' rows, indicating a data structure or pointer.

THE HASH TABLE

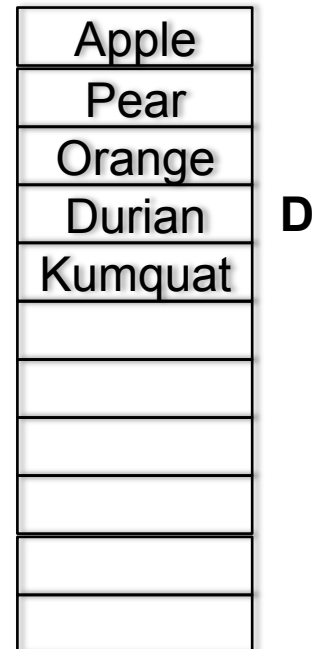
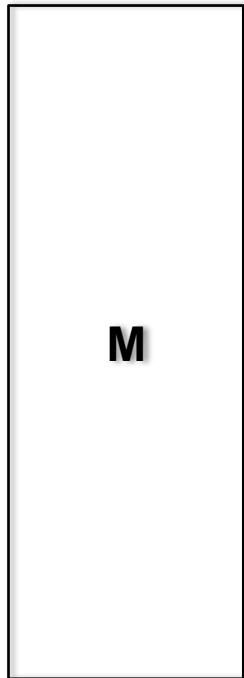
- **What is the problem here?**
 - Takes $O(D)$ time to find the word in the list!



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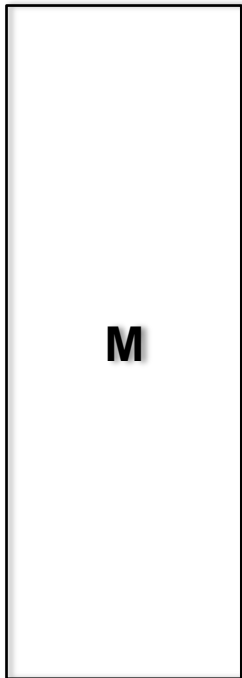
THE HASH TABLE

- **What is the problem here?**
 - Takes $O(D)$ time to find the word in the list
 - Same problem with sorted arrays!



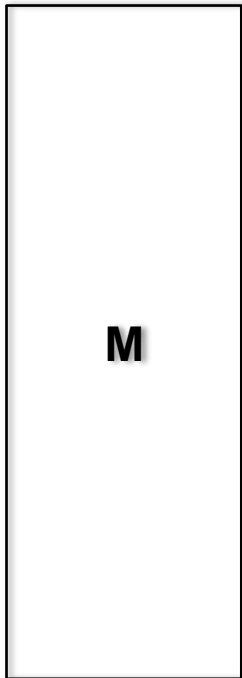
THE HASH TABLE

- What is another solution?



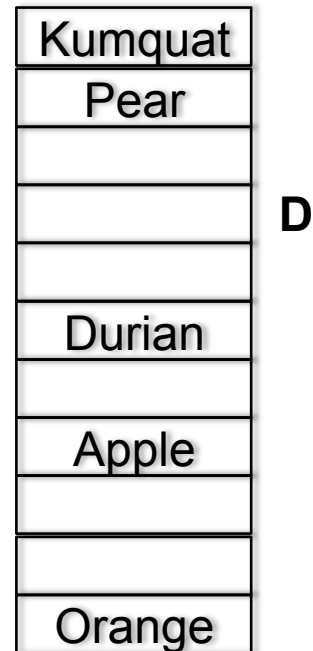
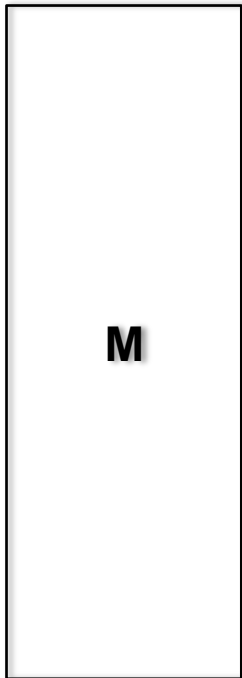
THE HASH TABLE

- What is another solution?
 - Random mapping



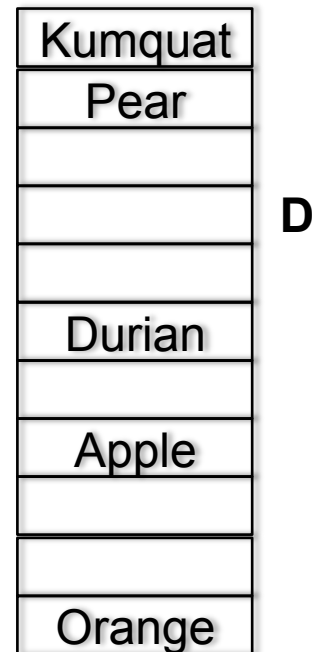
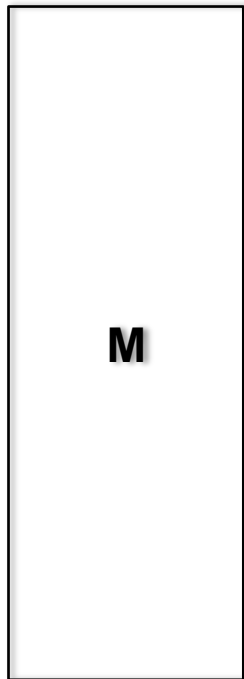
THE HASH TABLE

- What's the problem here?



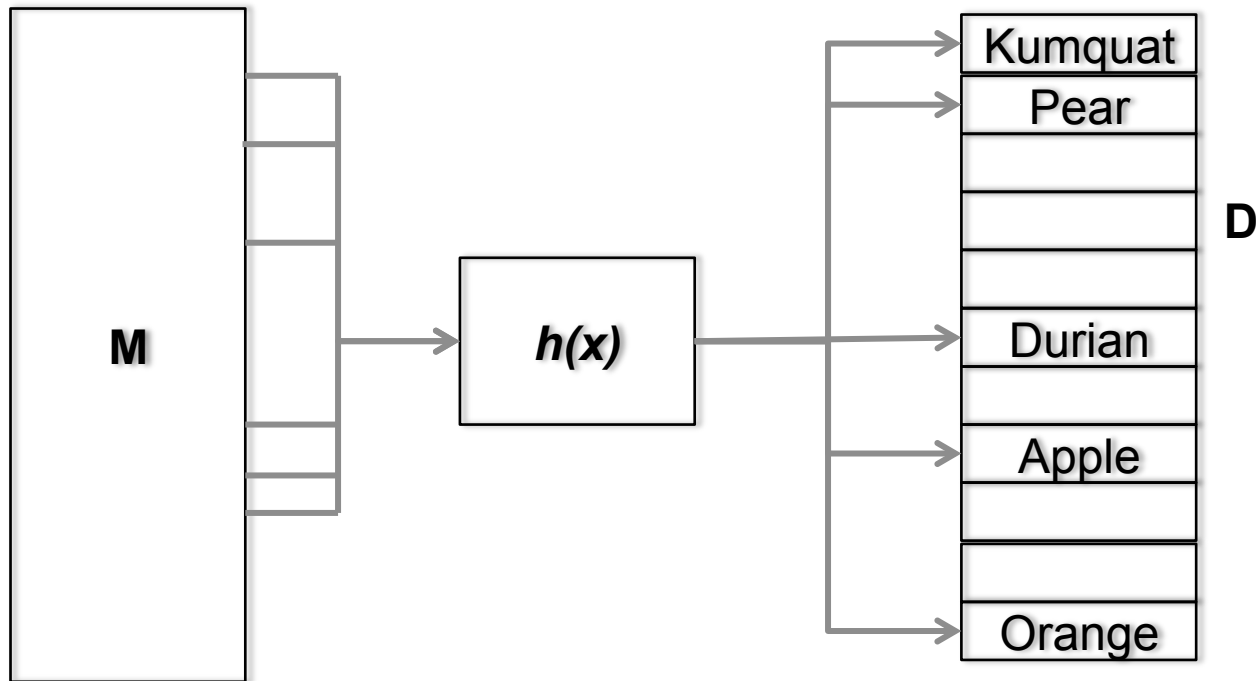
THE HASH TABLE

- **What's the problem here?**
 - Can't retrieve the random variable, $O(D)$ search!



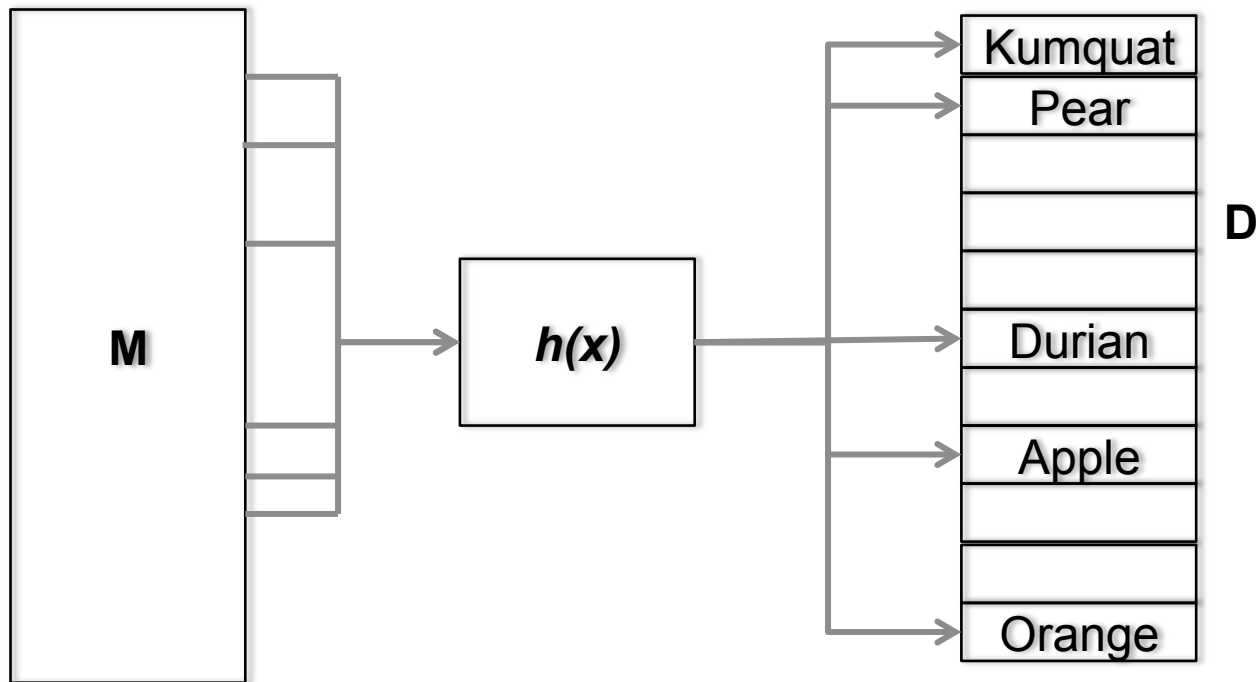
THE HASH TABLE

- What about a pseudo-random mapping?



THE HASH TABLE

- What about a pseudo-random mapping?
 - This is “the hash function”



HASH FUNCTIONS

- **The Hash Function maps the large space M to our target space D .**

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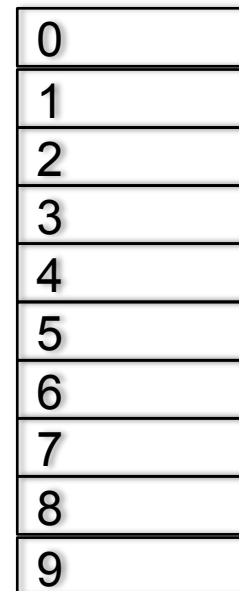
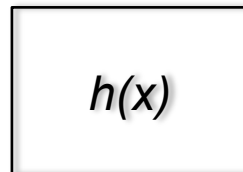
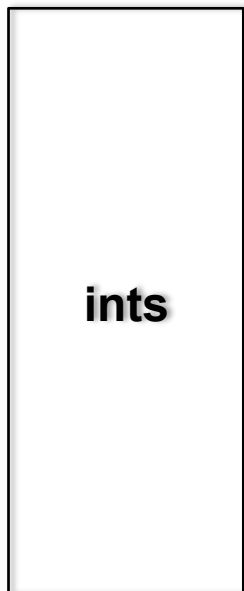
- The Hash Function maps the large space M to our target space D .
- We want our hash function to do the following:
 - Be repeatable: $H(x) = H(x)$ every run
 - Be equally distributed: For all y, z in D ,
 $P(H(y)) = P(H(z))$
 - Run in constant time: $H(x) = O(1)$

HASH EXAMPLE

- **Let's consider an example. We want to save 10 numbers from all possible Java ints**

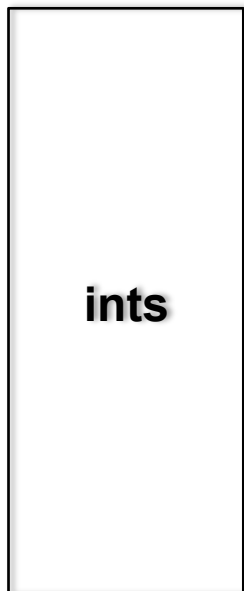
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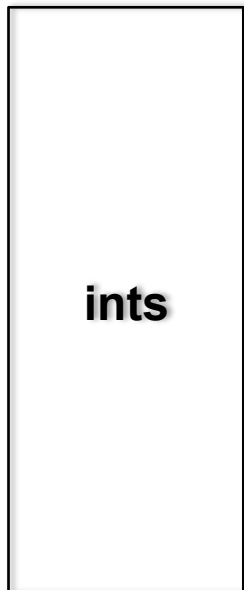


$$h(x) = \text{key} \% 10$$

0
1
2
3
4
5
6
7
8
9

HASH EXAMPLE

- Let's insert(519) table

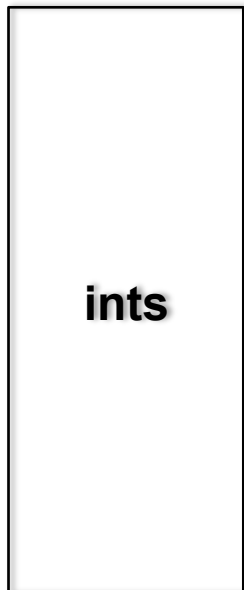


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HASH EXAMPLE

- Let's insert(519) table
 - Where does it go?

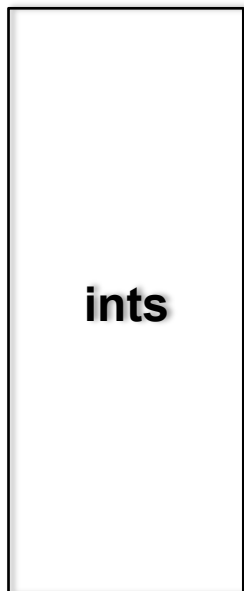


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 - $519\%10 =$

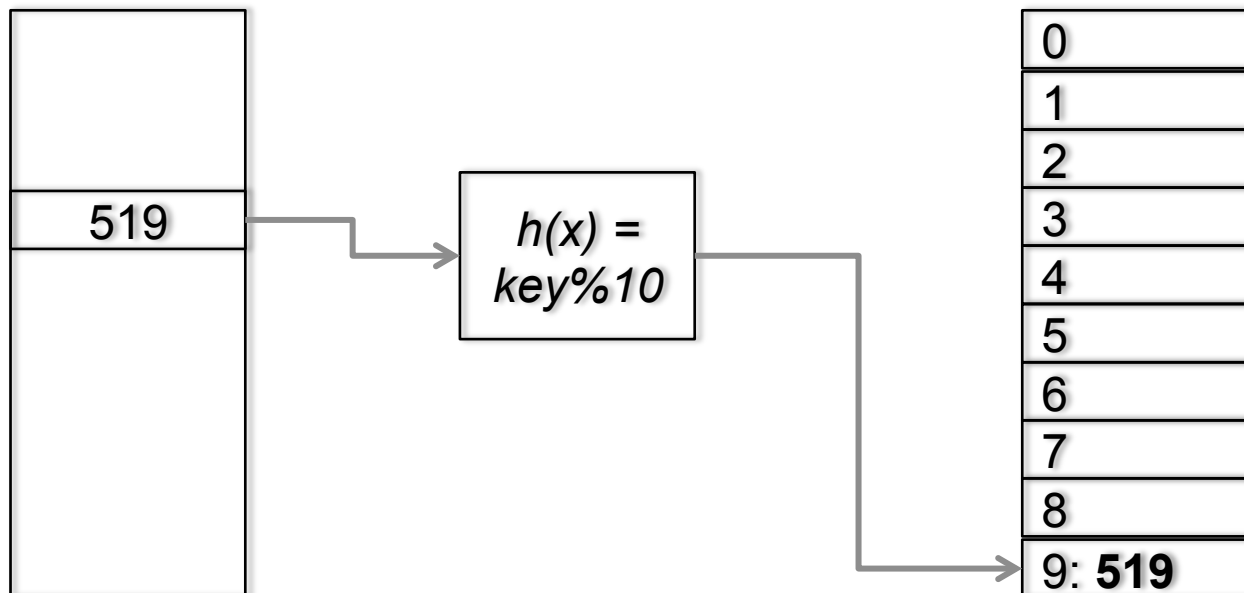


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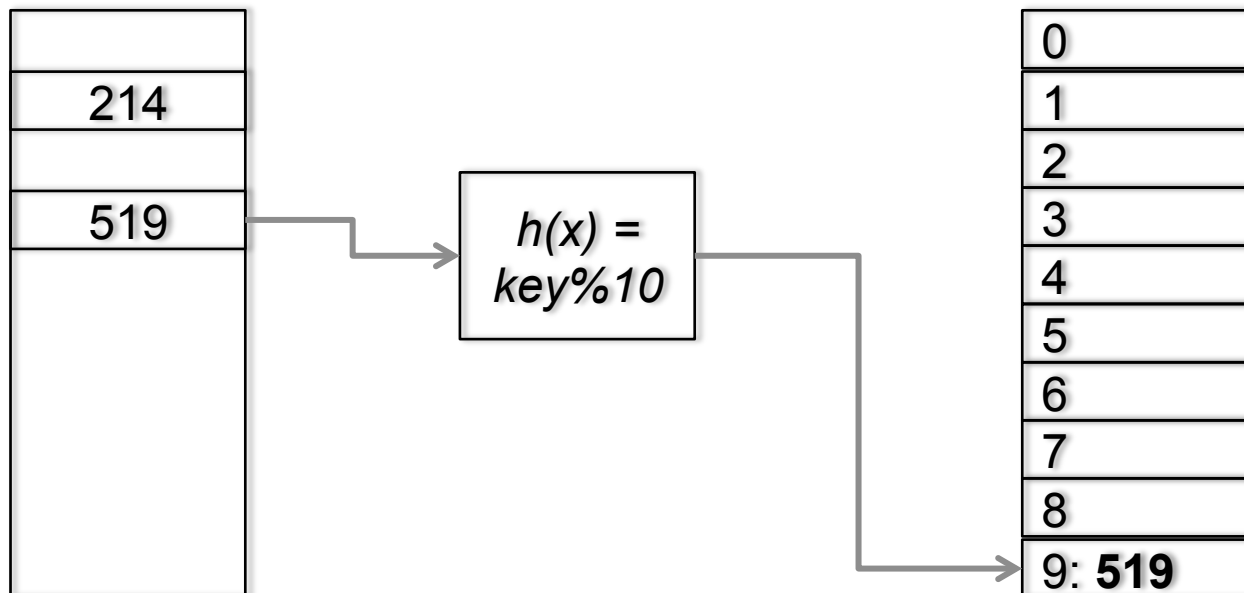
HASH EXAMPLE

- Let's insert(519) table
 - Where does it go?
 - $519\%10 = 9$



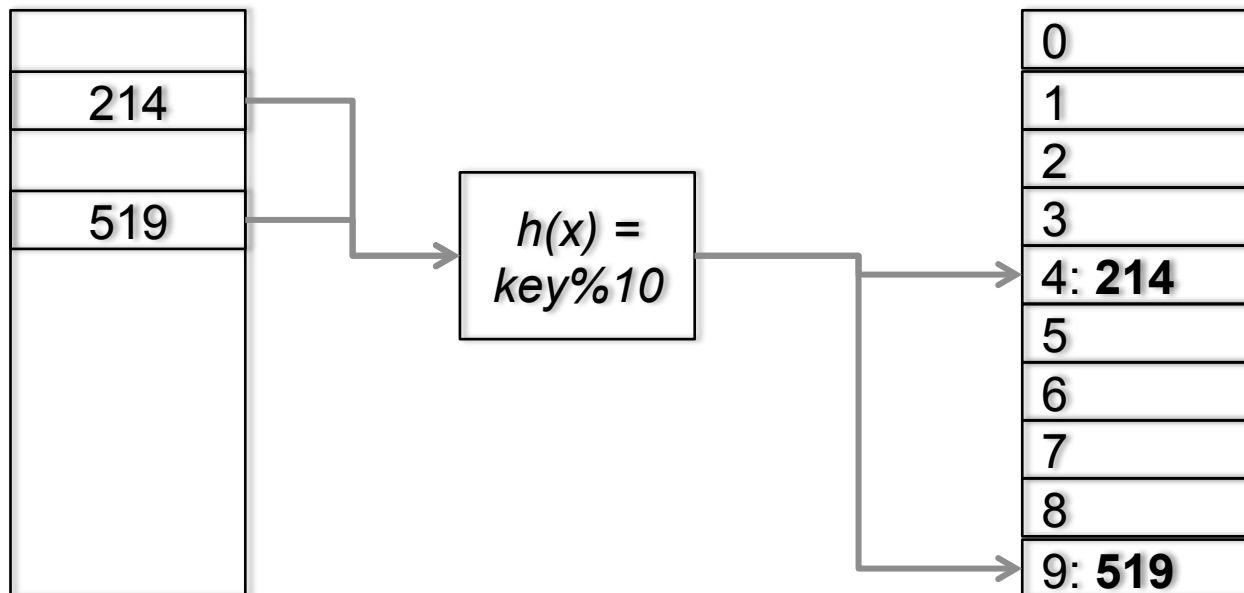
HASH EXAMPLE

- Insert(214)



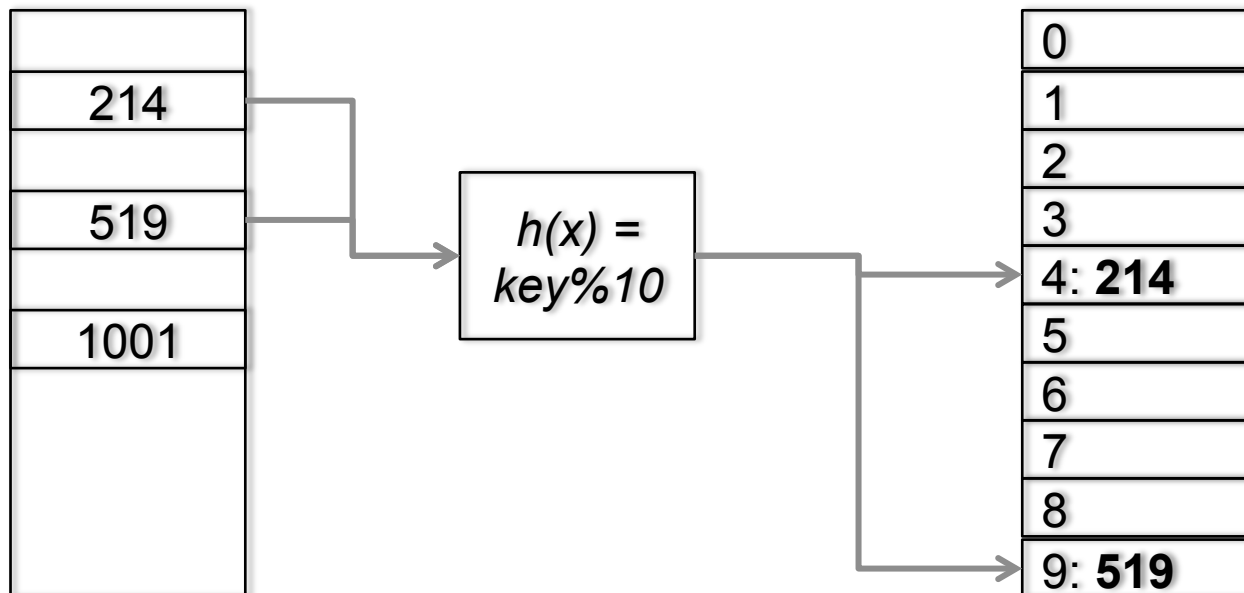
HASH EXAMPLE

- Insert(214)



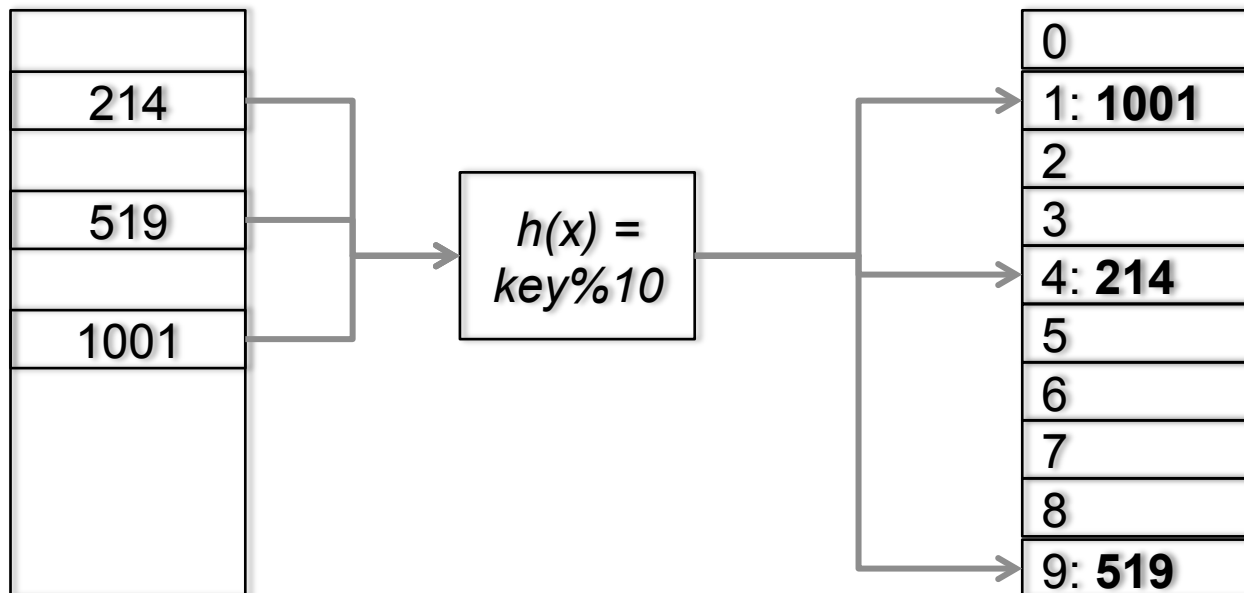
HASH EXAMPLE

- insert(1001)



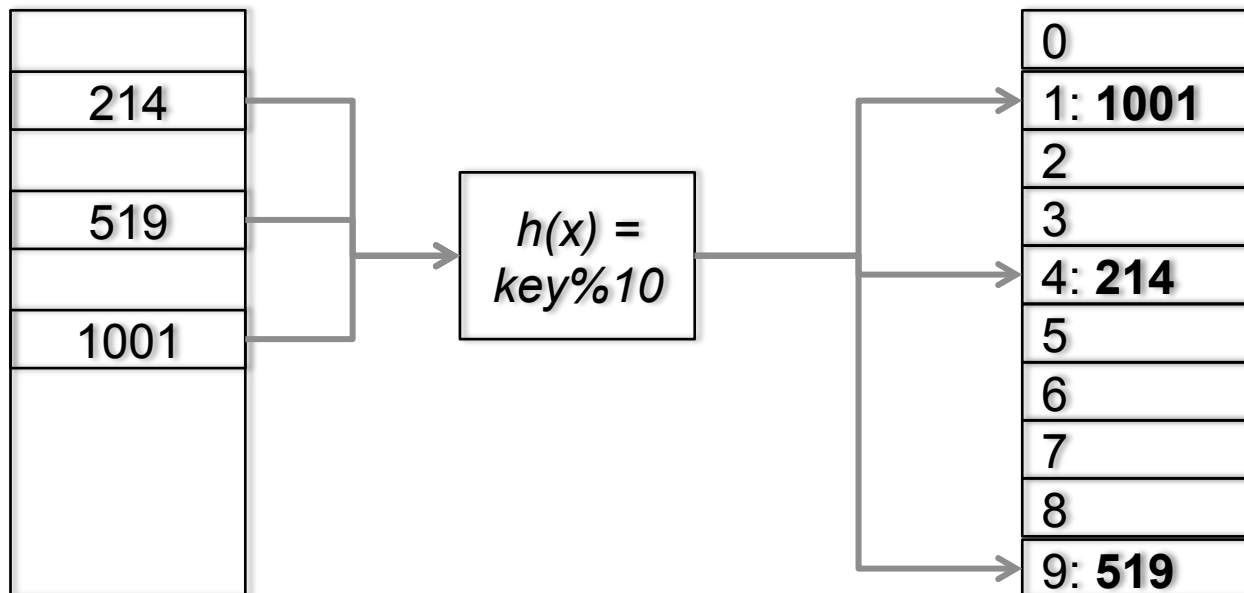
HASH EXAMPLE

- `insert(1001)`



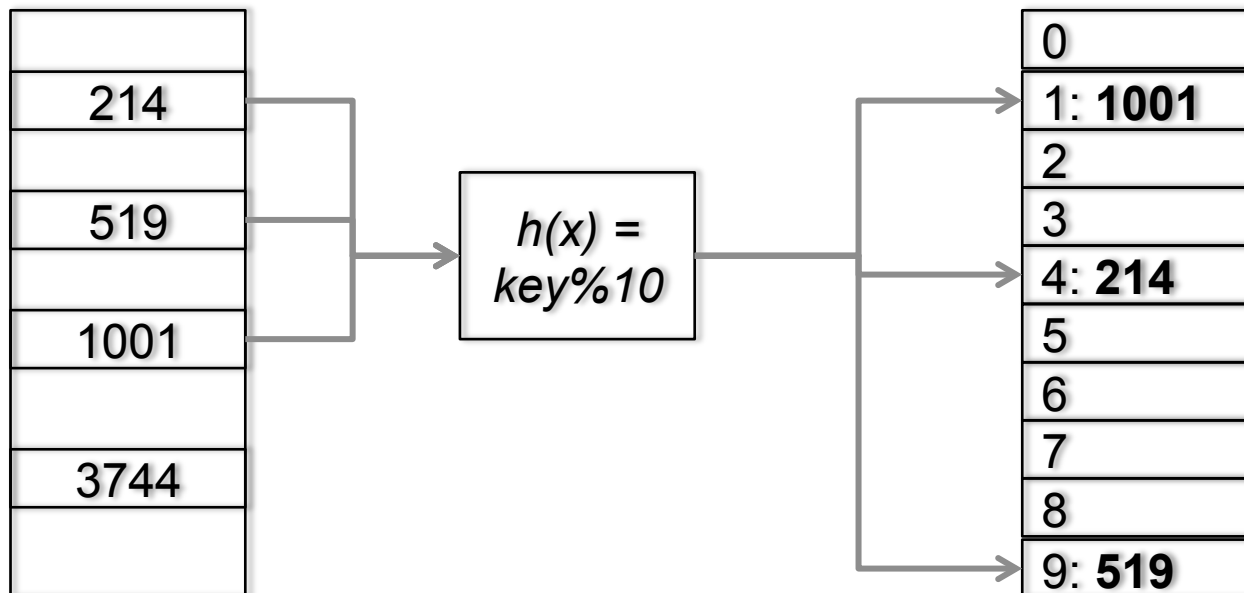
HASH EXAMPLE

- Is there a problem here?



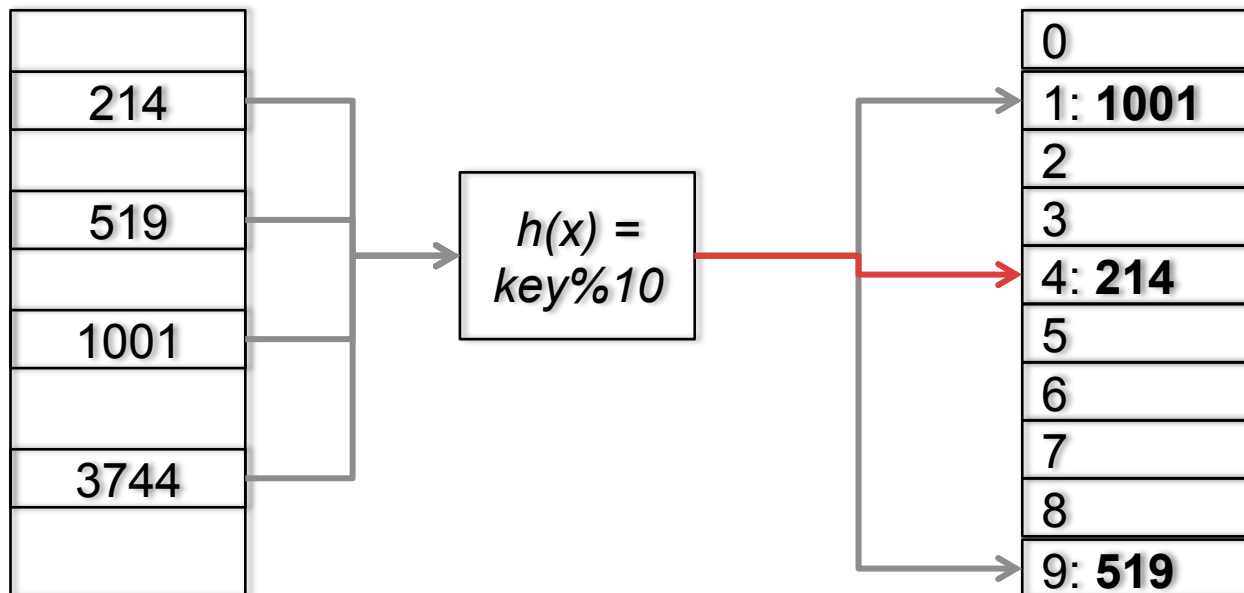
HASH EXAMPLE

- Is there a problem here?
 - insert(3744)



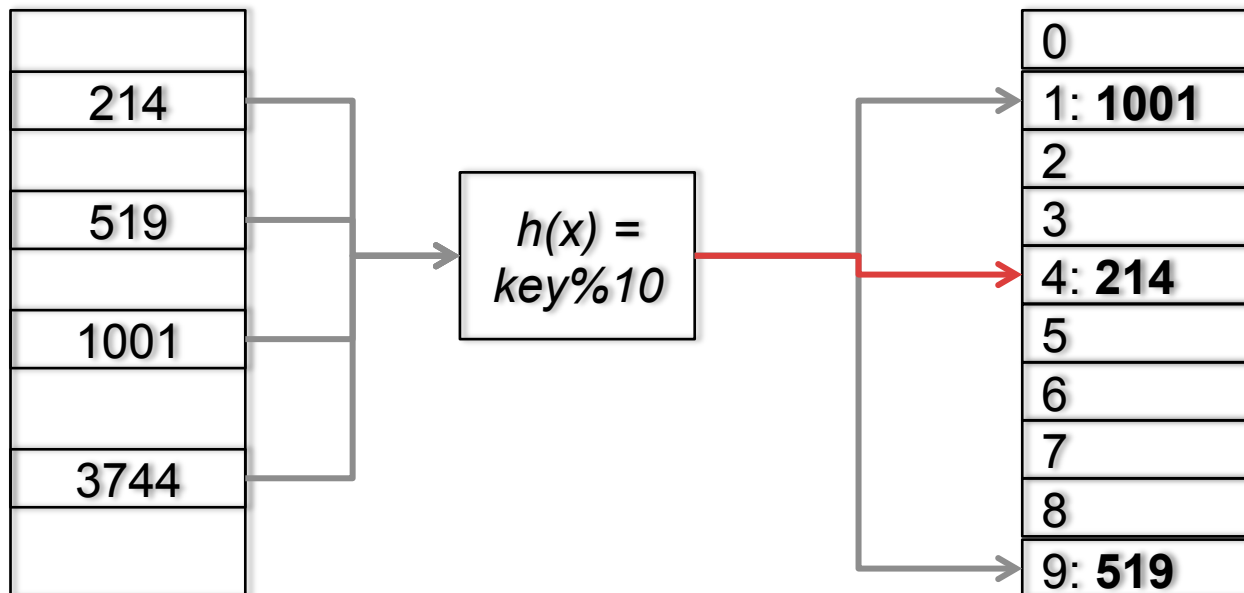
HASH EXAMPLE

- Is there a problem here?
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HASH EXAMPLE

- Is there a problem here?
 - insert(3744)
 - This is called a collision!



HASH FUNCTION

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 - We want a hash that distributes our data evenly throughout the space
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 - Needs to incorporate all the data in the keys

HASH FUNCTION

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- **You will not have to produce hash functions, but you should recognize good ones**
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 - They return an integer
- **These hash functions are chosen in advance, you should not pick a hash function relative to your data**

HASH EXAMPLE

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 - Store both in the same space
 - Try a different hash
 - Resize the array

HASH EXAMPLE

- **Consider the simplest solution**

HASH EXAMPLE

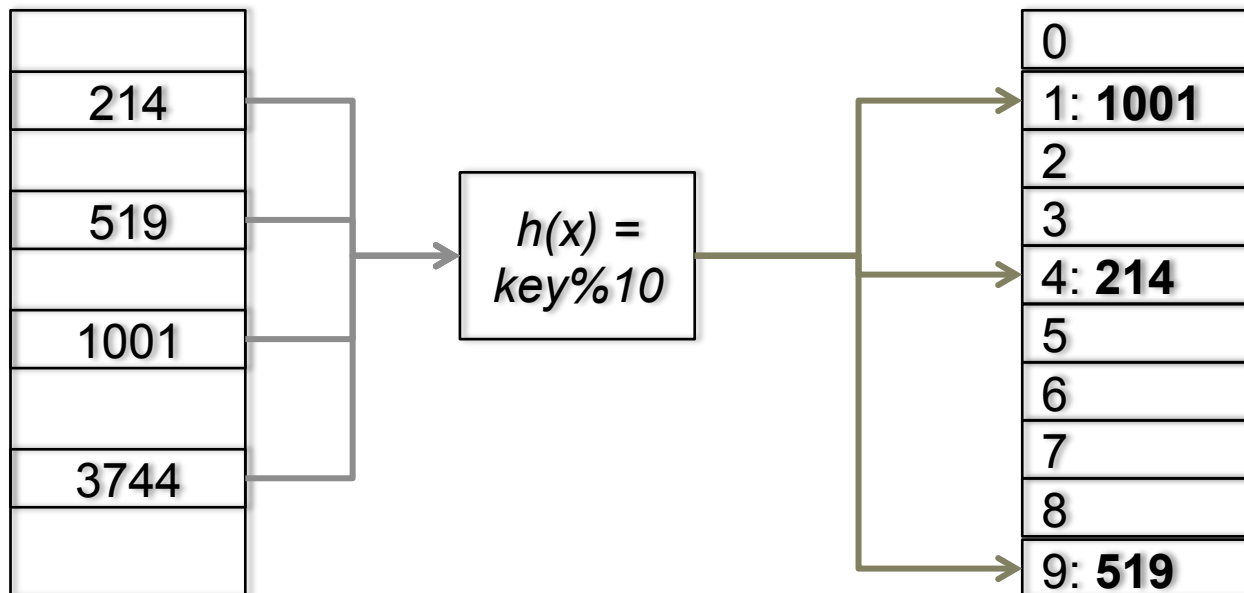
- **Consider the simplest solution**
 - Find the next available spot in the array

LINEAR PROBING

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 - It also ends up in this problem area
 - This is called **clustering**

CLUSTERING

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 - The chances of colliding with the cluster increase
 - The time it takes to find something in the cluster increases. **This isn't $O(1)$ time!**

CLUSTERING

- How can we solve this problem?

CLUSTERING

- **How can we solve this problem?**
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 - This is called **chaining**

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 - Resize the array
 - Give the elements more space to avoid clusters. *How long does this take? $O(n)$!* **all of the elements need to be rehashed.**
 - Store multiple items in one location
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 - We'll discuss it later

COLLISIONS

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COLLISIONS

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COLLISIONS

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 - Increase the index by one until a spot is found
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COLLISIONS

- **Probing**

- Linear probing

- Try the appropriate hash table row first
 - Increase the index by one until a spot is found
 - Guaranteed to find a spot if it is available
 - If the array is too full, its operations reach $O(n)$ time

COLLISIONS

- **Probing**
 - Quadratic Probing

COLLISIONS

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 - Rather than increasing by one each time, we increase by the squares

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 - $k+1$, $k+4$, $k+9$, $k+16$, $k+25$

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 - Certain tables can cause **secondary clustering**

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COLLISIONS

- **Probing**

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- Rather than increasing by one each time, we increase by the squares
 - $k+1$, $k+4$, $k+9$, $k+16$, $k+25$
 - Certain tables can cause **secondary clustering**
 - Can fail to insert if the table is over half full

COLLISIONS

- **Probing**
 - Secondary Hashing

COLLISIONS

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 - If two keys collide in the hash table, then a secondary hash indicates the probing size

COLLISIONS

- **Probing**

- **Secondary Hashing**

- If two keys collide in the hash table, then a secondary hash indicates the probing size
 - Need to be careful, possible for infinite loops with a very empty array

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- Commonly a linked list, AVL tree or secondary hash table.

COLLISIONS

- **Chaining**

- Rather than probing for an open position, we could just save multiple objects in the same position
- Some data structure is necessary here
- Commonly a linked list, AVL tree or secondary hash table.
- Resizing isn't **necessary**, but if you don't, you will get $O(n)$ runtime.

PRIMALITY

- **Array sizes**

PRIMALITY

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- We normally choose our hash tables to have prime size

PRIMALITY

- **Array sizes**

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- Two numbers x and y are **coprime** if they do not share any common factors.
- If the hash table size and the secondary hash value are coprime, then the search will succeed if there is space available
- However, many primes cause secondary clustering when used with quadratic probing

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 - We've discussed this a bit implicitly before
 - What are good load-factor (λ) values for each of our collision techniques?

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- **Linear Probing?**
- **Quadratic Probing?**
- **Secondary Hashing?**
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- **Linear Probing?** $0.25 < \lambda < 0.5$
- **Quadratic Probing?** $0.10 < \lambda < 0.30$
 - If it gets to 0.5, then there is a chance of failure, and a high chance of $O(n)$ runtime
- **Secondary Hashing?**
- **Chaining?**

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- **Linear Probing?** $0.25 < \lambda < 0.5$
- **Quadratic Probing?** $0.10 < \lambda < 0.30$
- **Secondary Hashing?** $0.25 < \lambda < 0.5$
 - But we've eliminated primary clustering
- **Chaining?**

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 - Because we allow multiple items in each space, we can increase memory efficiency by taking advantage
 - As long as there are a constant number in each space, we get $O(1)$ runtimes.

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- **As with most array data structures, you will need to resize when they get too full**
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 - Hash table maintenance is important
 - Resizing is costly (but still $O(n)$) because you have to resize the array and rehash every element into the new table.

HASH TABLES

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 - Can provide $O(1)$ access times
 - Can be memory inefficient
 - Probing can fail, and delete with probing mechanisms is difficult
 - Chaining can be a good balance, but there is a lot of overhead maintaining all those data structures

HASH TABLES

- **Understand these tradeoffs and how these implementations work**

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- **Section tomorrow will provide practice problems for each of these hash table methods**

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 - The hash function should run in constant time and should distribute among the indices in the target array
 - Linear probing is a solution for collisions, but only works when there is lots of free space
 - Resizing is very costly

NEXT CLASS

- **Hash Tables**
 - Examples, examples, examples
 - Finish discussion
- **Exam review**