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# CS 261 – Data Structures

## Hash Tables

### Open Address Hashing

# ADT Dictionaries

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**computer** |kəm'pyoūtər|

noun

- an electronic device for storing and processing data...
- a person who makes calculations, esp. with a calculating machine.

# Dictionaries

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**computer** |kəm'pyoūtər|

**key**

noun

- an electronic device for storing and processing data...
- a person who makes calculations, esp. with a calculating machine.

# Dictionaries

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**computer** |kəm'pyoōtər|

**value**

noun

- an electronic device for storing and processing data...
- a person who makes calculations, esp. with a calculating machine.

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How to implement dictionaries?

# Hash Tables

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Similar to dynamic arrays except:

1. Elements can be indexed by their **keys** whose type may differ from integer
2. In general, a single position may hold more than one element

# Computing a Hash Table Index: 2 Steps

1. Transform the key to an integer
  - by using the hash function
2. Map the resulting integer to a valid hash table index
  - by using the remainder of dividing the integer with the table size

# Example

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Say, we're storing names:

Angie

Joe

Abigail

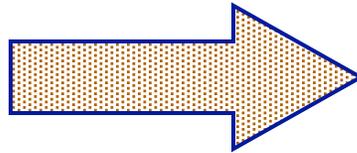
Linda

Mark

Max

Robert

John



0	Angie, Robert
1	Linda
2	Joe, Max, John
3	
4	Abigail, Mark

# **Example: Computing the Hash Table Index**

## **Storing names:**

- Compute an integer from the name
- Map the integer to an index in a table

# Hash Function

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Hash function maps the keys to integers

# Hash Function: Types

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Mapping:

Map (a part of) the key into an integer

- Example: a letter to its position in the alphabet

# Hash Function: Types

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## Folding:

Parts of the key combined by operations, such as add, multiply, shift, XOR, etc.

- Example: summing the values of each character in a string

# Hash Function: Types

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Shifting + Folding:

Shift left the name  
to get rid of repeating low-order bits

or

Shift right the name  
to multiply by powers of 2

Example: if keys are always even, shift off  
the low order bit

# Hash Function: Combinations

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Map, Fold, and Shift combination

Key	Mapped chars	Folded	Shifted and Folded
eat	$5 + 1 + 20$	26	$20 + 2 + 20 = 42$
ate	$1 + 20 + 5$	26	$4 + 40 + 5 = 49$
tea	$20 + 5 + 1$	26	$80 + 10 + 1 = 91$

# Hash Function: Types

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Casts:

Converting a numeric type into an integer

- Example: casting a character to an integer to get its ASCII value

# Hash Functions: Examples

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– Key = Character:

char value cast to an int  $\rightarrow$  it's ASCII value

– Key = Date:

value associated with the current time

– Key = Double:

value generated by its bitwise representation

# Hash Functions: Examples

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– Key = Integer:

the int value itself

– Key = String:

a folded sum of the character values

– Key = URL:

the hash code of the host name

## **Step 2: Mapping to a Valid Index**

- Use modulus operator (%) with table size:

- Example:

```
idx = hash(val) % size;
```

- Must be sure that the final result is positive
  - Use only positive arithmetic or take absolute value

## **Step 2: Mapping to a Valid Index**

To get a good distribution of indices,  
prime numbers make the best table sizes.

- Example: if you have 1000 elements, a table size of 997 or 1009 is preferable

# Hash Tables: Ideal Case

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1. **Perfect hash function:** each data element hashes to a unique hash index
2. Table size equal to (or slightly larger than) number of elements

# Perfect Hashing: Example

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- Six friends have a club: Alfred, Alessia, Amina, Amy, Andy, and Anne
- Store member names in a six element array
- Convert 3<sup>rd</sup> letter of each name to an index:

Alfred	$f = 5 \% 6 = 5$
Alessia	$e = 4 \% 6 = 4$
Amina	$i = 8 \% 6 = 2$
Amy	$y = 24 \% 6 = 0$
Andy	$d = 3 \% 6 = 3$
Anne	$n = 13 \% 6 = 1$

# Hash Tables: Collisions

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- Unless the data is known in advance, the ideal case is usually not possible
- A *collision* is when two or more different keys result in the same hash table index
- How do we deal with collisions?

# Indexing: Faster Than Searching

- Can convert a name (e.g., Alessia) into a number (e.g., 4) in constant time
- Faster than searching
- Allows for  $O(1)$  time operations

# Indexing: Faster Than Searching

Becomes complicated for new elements:

–Alan wants to join the club:

‘a’ = 0 → same as Amy

–Also:

Al wants to join → no third letter!

# Hash Tables: Resolving Collisions

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There are two general approaches to resolving collisions:

1. Open address hashing: if a spot is full, probe for next empty spot
2. Chaining (or buckets): keep a collection at each table entry

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# Open Address Hashing

# Open Address Hashing

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- All values are stored in an array
- Hash value is used to find initial index to try
- If that position is filled, next position is examined, then next, and so on until an empty position is filled

# Open Address Hashing

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- The process of looking for an empty position is termed *probing*,
- Specifically, we consider linear probing
- There are other probing algorithms, but we won't consider them

# Open Address Hashing: Example

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Eight element table using the third-letter hash function:

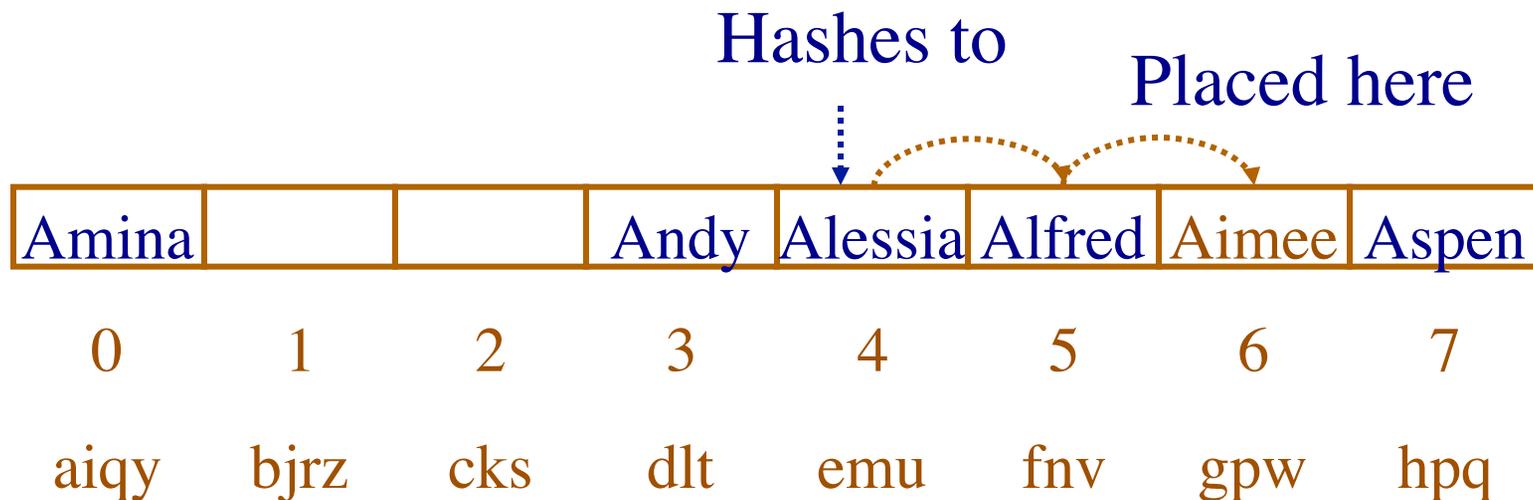
Already added: Amina, Andy, Alessia, Alfred, and Aspen

Amina			Andy	Alessia	Alfred		Aspen
0	1	2	3	4	5	6	7
aiqy	bjrz	cks	dlt	emu	fnv	gpw	hpq

# Open Address Hashing: Adding

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Now we need to add: **Aimee**

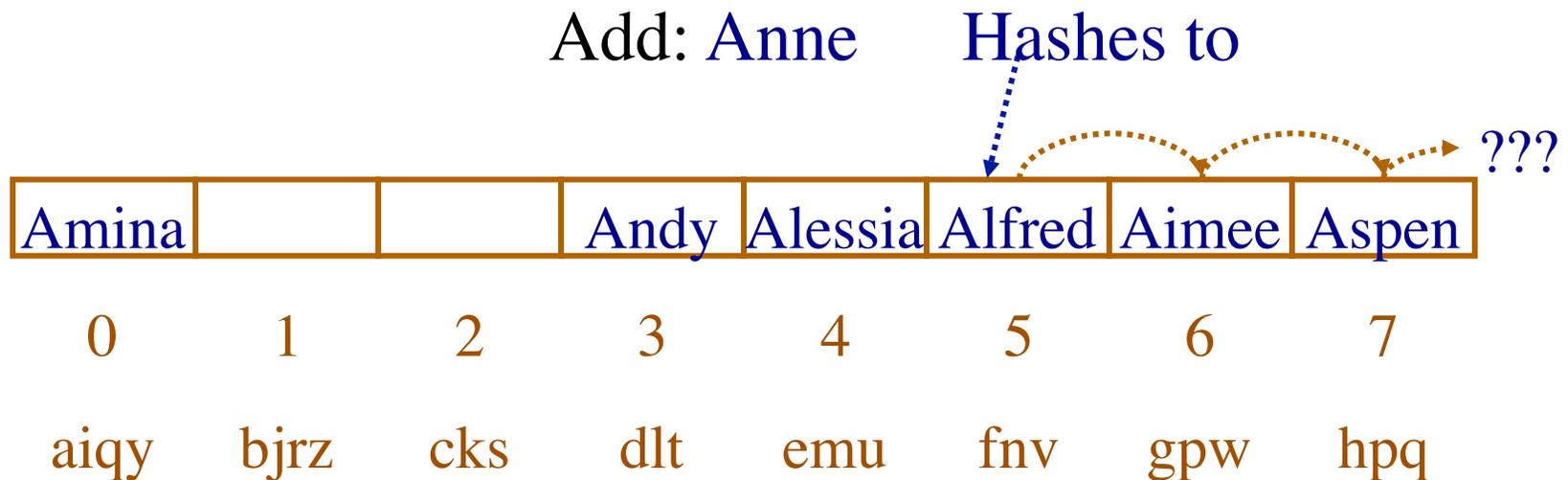


The hashed index position (4) is filled by Alessia:  
so we probe to find next free location

# Open Address Hashing: Adding

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Suppose **Anne** wants to join:



The hashed index position (5) is filled by Alfred:

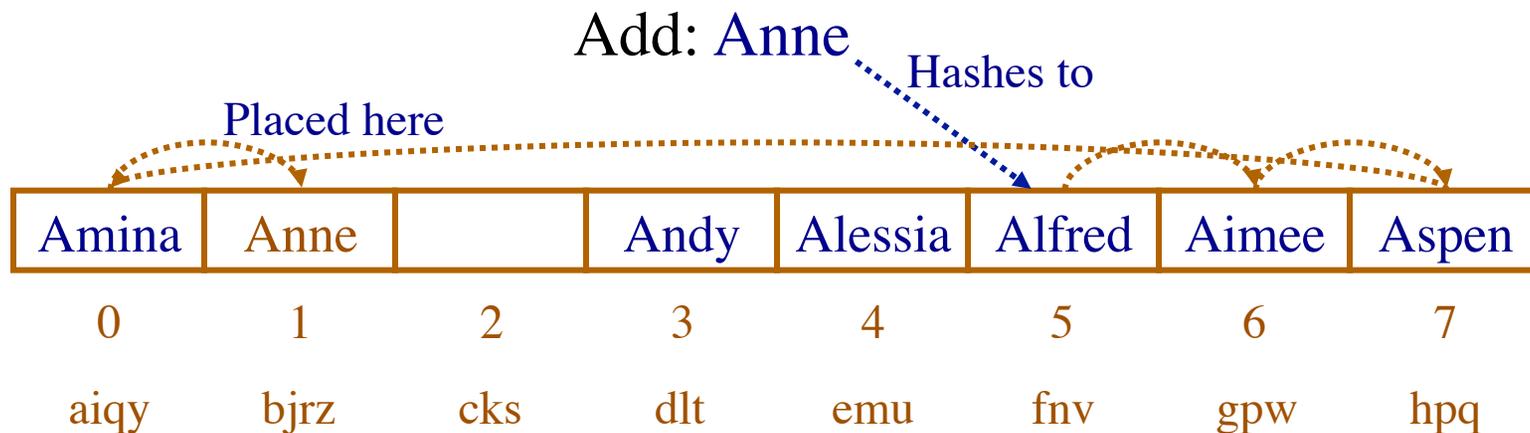
Probe to find next free location

What happens when we reach the end of the array?

# Open Address Hashing: Adding

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Suppose **Anne** wants to join:



The hashed index position (5) is filled by Alfred:

- Probe to find next free location
- When we get to end of array, wrap around to the beginning
- Eventually, find position at index 1 open

# Open Address Hashing: Adding

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Finally, **Alan** wants to join:

Hashes to

Placed here

Amina	Anne	Alan	Andy	Alessia	Alfred	Aimee	Aspen
0	1	2	3	4	5	6	7
aiqy	bjrz	cks	dlt	emu	fnv	gpw	hpq

The hashed index position (0) is filled by Amina:

- Probing finds last free position (index 2)
- Collection is now completely filled

# Open Address Hashing: Contains

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- Hash to find initial index, probe forward examining each location until value is found, *or empty location is found.*
- Example, search for: Amina, Aimee, Anne...

Amina	Anne	Alan	Andy	Alessia	Alfred	Aimee	Aspen
0	1	2	3	4	5	6	7
aiqy	bjrz	cks	dlt	emu	fnv	gpw	hpq

- Notice that search time is not uniform

# Open Address Hashing: Remove

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- Remove is tricky: Can't leave this place empty
- What happens if we delete **Anne**, then search for **Alan**?

Remove: Anne

Amina	<del>Anne</del>	Alan	Andy	Alessia	Alfred	Aimee	Aspen
0-aiqy	1-bjrz	2-cks	3-dlt	4-emu	5-fnv	6-gpw	7-hpq

Find: Alan

Hashes to

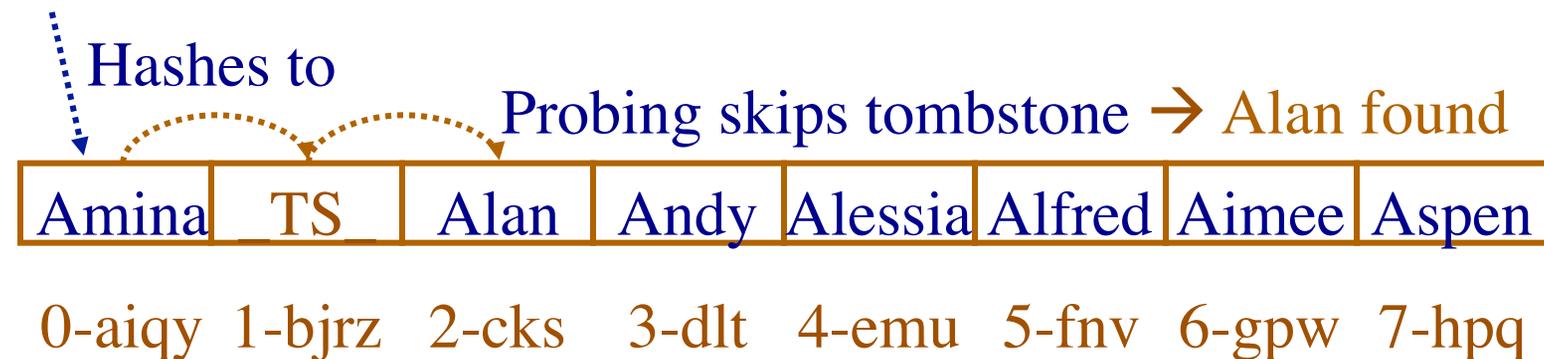
Probing finds null entry → Alan not found

Amina		Alan	Andy	Alessia	Alfred	Aimee	Aspen
0-aiqy	1-bjrz	2-cks	3-dlt	4-emu	5-fnv	6-gpw	7-hpq

# Open Address Hashing: Handling Remove

- Replace removed item with “tombstone”
  - Special value that marks deleted entry
  - Can be replaced when adding new entry
  - But doesn't halt search during contains (remove)

Find: Alan



# Hash Table Size: Load Factor

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Load factor:

$$\lambda = n / m$$

Diagram illustrating the load factor formula  $\lambda = n / m$ . The formula is centered. A dotted arrow points from the text "Load factor" on the left to the symbol  $\lambda$ . A dotted arrow points from the text "# of elements" above to the variable  $n$ . A dotted arrow points from the text "Size of table" on the right to the variable  $m$ .

- Load factor is the average number of elements at each table entry
- For open address hashing, load factor is between 0 and 1 (often somewhere between 0.5 and 0.75)
- For chaining, load factor can be greater than 1
- Want the load factor to remain small

## **Large Load Factor: What to do?**

- Common solution: When load factor becomes too large (say, bigger than 0.75) → Reorganize
- Create new table with twice the number of positions
- Copy each element, rehashing using the new table size, placing elements in new table
- Delete the old table

# Hash Tables: Algorithmic Complexity

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- Assumptions:
  - Time to compute hash function is constant
  - Worst case analysis  $\rightarrow$  All values hash to same position
  - Best case analysis  $\rightarrow$  Hash function uniformly distributes the values

# Hash Tables: Algorithmic Complexity

- Find element operation:
  - Worst case for open addressing  $\rightarrow O(n)$
  - Best case for open addressing  $\rightarrow O(1)$

# Hash Tables: Average Case

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- What about average case?

- Turns out, it's

$$1 / (1 - \lambda)$$

- So keeping load factor small is very important

$\lambda$	$1 / (1 - \lambda)$
0.25	1.3
0.5	2.0
0.6	2.5
0.75	4.0
0.85	6.6
0.95	19.0

# Difficulties with Hash Tables

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- Need to find good hash function → uniformly distributes keys to all indices
- Open address hashing:
  - Need to tell if a position is empty or not
  - One solution → store only pointers
- Open address hashing: problem with removal