

COMP20230: Data Structures & Algorithms

Lecture 12: Hash Tables

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Last Day:



Today: Hash Tables

Hash Tables: Searchable Data Structures

Example Symbol Tables

| Application | Purpose of Search | Key | Value |
|--------------------|---------------------------------------|----------------|------------------------------|
| dictionary | find word definition | word | definition |
| book index | find relevant pages, word occurrences | term | list of page numbers |
| account management | process transaction | account number | transaction details |
| web search | find relevant web pages | keyword | list of page titles and urls |
| compiler | find type and value of variable | variable name | type and value |

ADT of a symbol table

For an **unordered symbol table** the ADT has the following operations:

| | |
|------------------------------|---|
| <code>put(key, value)</code> | put key-value pair into the table |
| <code>get(key)</code> | value paired with key (null if key is absent) |
| <code>delete(key)</code> | remove key from table and value paired with key |
| <code>contains(key)</code> | is there a value paired with key? |
| <code>isEmpty()</code> | is the table empty? |
| <code>size()</code> | number of key-value pairs in the table |
| <code>keys()</code> | all the keys in the table |

ADT of a symbol table

For an **unordered symbol table** the ADT has the following operations:

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| <code>contains(key)</code> | is there a value paired with key? |
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| <code>size()</code> | number of key-value pairs in the table |
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Aside: Ordered Symbol Table ADT

If we want to keep our symbols ordered, we need to keep information about their rank and a number of other operations are required:

`min()`, `max()`, `floor(key)`, `ceiling(key)`, `rank(key)`,
`select(rank)`, `deleteMin()`, `deleteMax()`,
`size(low_key,high_key)`, `keys(low_key,high_key)`

Three classic data structures that can support efficient searchable symbol-table implementations:

- 1 Hash tables
- 2 Binary search trees
- 3 Balanced search Trees: 2–3 Trees, Red-black trees, AVL Trees



Hash figures adapted from:

Algorithms (Sedgewick & Wayne)

Hash Tables

Hash Tables

Save items in a key-indexed table (index is a function of the key)

Hash Function

Method for computing array index from a key.

`hash("it") = 3`



| | |
|---|------|
| 0 | |
| 1 | |
| 2 | |
| 3 | "it" |
| 4 | |
| 5 | |

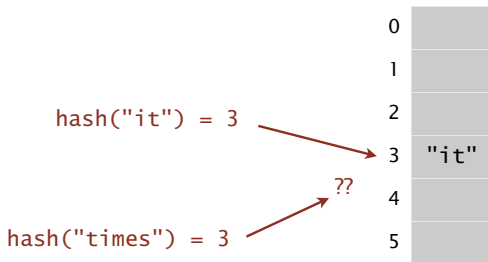
Hash Tables: Requirements and Issues

Compute the hash function

Good algorithm (i.e. fast, efficient, scalable etc.)

Collision resolution

Algorithm and data structure to handle two keys that hash to the same array index



Example: Python Dictionary

```
airports={"JFK": ("John F Kennedy Intl","United States",40.639751, -73.778925),
          "SYD": ("Sydney Intl","Australia",-33.946111,151.177222),
          "LHR": ("London Heathrow","United Kingdom",51.4775,-0.461389)}

# print a search result
print(airports["SYD"])
print("Airport Keys: ", airports.keys())

# add an airport to the dictionary
airports["AMS"]=("Schiphol","Netherlands",52.308613,4.763889)

# store the value of a search and print it
destination=airports.get("AMS")
print(destination)

# pop (search and remove) a value from dict and save it in a variable
oz_airport = airports.pop("SYD")
print("Airport Keys: ", airports.keys())

# what is the hash for key AMS?
# Does it change if I call it twice? What if I rerun the program?
print("AMS hash is:", hash("AMS"))
print("AMS hash is:", hash("AMS"))
print("DUB hash is:", hash("DUB"))
```

Output:

```
('Sydney Intl', 'Australia', -33.946111, 151.177222)
Airport Keys: dict_keys(['JFK', 'SYD', 'LHR'])
('Schiphol', 'Netherlands', 52.308613, 4.763889)
Airport Keys: dict_keys(['JFK', 'LHR', 'AMS'])
AMS hash is: 6708379502801481095
AMS hash is: 6708379502801481095
DUB hash is: -3052993293245237079
```

Hash Tables: Computing the Hash Function

Ideally: Scramble the keys uniformly to produce

Equally computable table index

Each table index equally likely for each key.

Hash Codes

Integers, e.g.

Most significant part of a float;

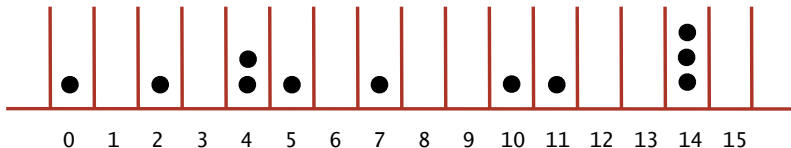
Memory address of an object



Hash Tables

Uniform Hashing Assumption

Each key is equally likely to hash to an integer between 0 and $M - 1$.

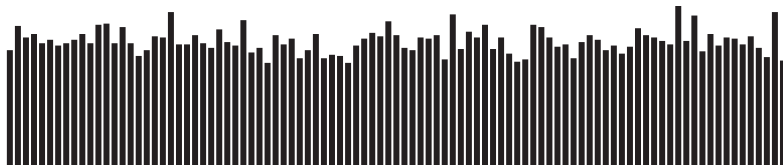


Bins and Balls

Evenly distribute balls into the slots of a hash table.
Throw balls aiming for uniform distribution at M bins.

Example Hash Table

Java hash table implementation result for distributing keys of strings (words) in Tale of Two Cities. ($M=97$)



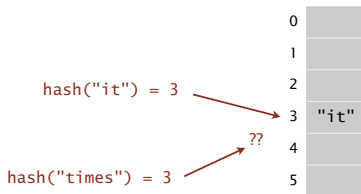
Hash value frequencies for words in Tale of Two Cities ($M = 97$)

Hash Tables

Collisions

Two distinct keys hashing to same index

Collisions inevitable (unless *dynamic perfect hashing* implemented – memory hungry!).



Birthday Problem

How many birthdays on the same day in a class of 70? With only 23 people, the probability that two people have same birthday is 50%

Implementation

Separate Chaining Symbol Table

Linear Probing

Separate Chaining Symbol Table

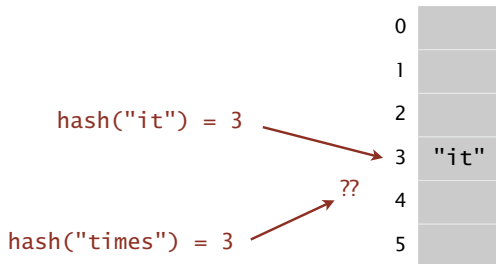
M lists and N keys.

Use an array of $M < N$ linked lists

Hash: Map key to integer i between 0 and $M - 1$

Insert: Put at front of i th chain (if not already there)

Search: Need to search only i th chain



Separate Chaining Symbol Table

| key | hash | value |
|-----|------|-------|
|-----|------|-------|

| | | |
|---|---|---|
| S | 2 | 0 |
|---|---|---|

| | | |
|---|---|---|
| E | 0 | 1 |
|---|---|---|

| | | |
|---|---|---|
| A | 0 | 2 |
|---|---|---|

| | | |
|---|---|---|
| R | 4 | 3 |
|---|---|---|

| | | |
|---|---|---|
| C | 4 | 4 |
|---|---|---|

| | | |
|---|---|---|
| H | 4 | 5 |
|---|---|---|

| | | |
|---|---|---|
| E | 0 | 6 |
|---|---|---|

| | | |
|---|---|---|
| X | 2 | 7 |
|---|---|---|

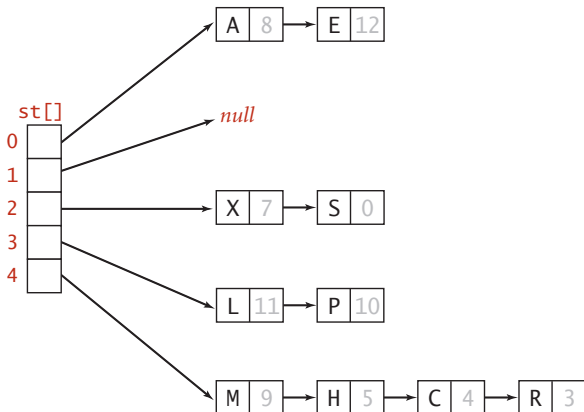
| | | |
|---|---|---|
| A | 0 | 8 |
|---|---|---|

| | | |
|---|---|---|
| M | 4 | 9 |
|---|---|---|

| | | |
|---|---|----|
| P | 3 | 10 |
|---|---|----|

| | | |
|---|---|----|
| L | 3 | 11 |
|---|---|----|

| | | |
|---|---|----|
| E | 0 | 12 |
|---|---|----|



Separate Chaining Symbol Table

Getting the balance right: what size for balance between insert and search?

Analysis

Under uniform hashing assumption, prob. that the number of keys in a list is within a constant factor of N/M is extremely close to 1

Consequences

Number of probes for search/insert is proportional to N/M

M too large \Rightarrow too many empty chains

M too small \Rightarrow chains too long

Typical choice: $M \sim N/4 \Rightarrow$ constant-time ops

Separate Chaining Symbol Table

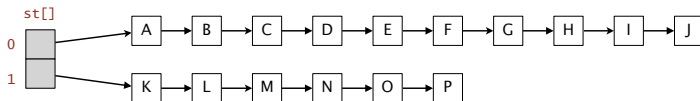
Resizing: Average length of list $N/M = \text{constant}$

Double size of array M when $N/M \geq 8$

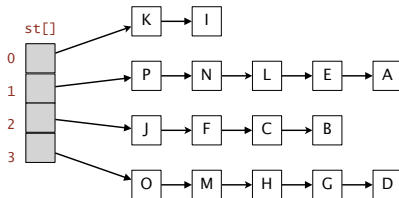
Halve size of array M when $N/M \leq 2$

Need to rehash all keys when resizing

before resizing



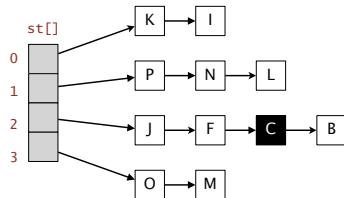
after resizing



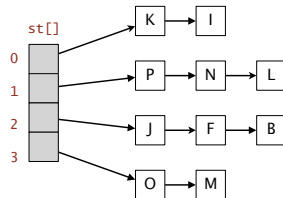
Separate Chaining Symbol Table

Deleting is straight-forward

before deleting C



after deleting C



Collision Resolution Strategy: Use Open Addressing

Open addressing

When a new key collides, find next empty slot, and put it there

st[0]

jocularly

st[1]

null

st[2]

listen

st[3]

suburban

⋮

null

st[30000]

browsing

Linear-probing Hash Table

Linear-probing

Open addressing scheme for resolving collisions in hash tables

Hash: Map key to integer i between 0 and $M - 1$ **Insert:** Put at table index i if free; if not try $i + 1$, $i + 2$, etc. **Search:** Search table index i ; if occupied but no match, try $i + 1$, $i + 2$, etc.

Note

Array size M must be greater than number of key-value pairs N

Example of Linear Probing (video on moodle)

| key | hash | value | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|-----|------|-------|----|---|---|---|---|---|---|---|----|---|----|----|----|----|----|----|
| S | 6 | 0 | | | | | | | S | | | | | | | | | |
| E | 10 | 1 | | | | | | | 0 | | | | E | | | | | |
| A | 4 | 2 | | | | | A | | S | | | | E | | | | | |
| R | 14 | 3 | | | | | 2 | | 0 | | | | 1 | | | | R | |
| C | 5 | 4 | | | | | A | C | S | | | | E | | | | R | |
| H | 4 | 5 | | | | | 2 | 5 | 0 | | | | 1 | | | | 3 | |
| E | 10 | 6 | | | | | A | C | S | H | | | E | | | | R | |
| X | 15 | 7 | | | | | 2 | 5 | 0 | 5 | | | 6 | | | | 3 | X |
| A | 4 | 8 | | | | | A | C | S | H | | | E | | | | R | X |
| M | 1 | 9 | | M | | | 8 | 5 | 0 | 5 | | | 6 | | | | 3 | 7 |
| P | 14 | 10 | P | M | | | 8 | 5 | 0 | 5 | | | 6 | | | | R | X |
| L | 6 | 11 | P | M | | | A | C | S | H | L | | E | | | | R | X |
| E | 10 | 12 | 10 | 9 | | | 8 | 5 | 0 | 5 | 11 | | 6 | | | | 3 | 7 |
| | | | P | M | | | A | C | S | H | L | | E | | | | R | X |
| | | | 10 | 9 | | | 8 | 5 | 0 | 5 | 11 | | 12 | | | | 3 | 7 |

entries in red are new

entries in gray are untouched

keys in black are probes

probe sequence wraps to 0

keys[]

vals[]

Linear Probing Hash Table

Resizing: Average length of list $N/M \leq 1/2$

Double size of array M when $N/M \leq 1/2$

Halve size of array M when $N/M \geq 1/8$

Need to rehash all keys when resizing.

before resizing

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|--------|---|---|---|---|---|---|---|---|
| keys[] | | E | S | | | R | A | |
| vals[] | | 1 | 0 | | | 3 | 2 | |

after resizing

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|--------|---|---|---|---|---|---|---|---|---|---|----|----|----|----|----|----|
| keys[] | | | | | A | | S | | | | E | | | | R | |
| vals[] | | | | | 2 | | 0 | | | | 1 | | | | 3 | |

Linear Probing Hash Table

Deletion: What happens if we delete S from hash table?

before deleting S

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|--------|----|---|---|---|---|---|---|---|----|---|----|----|----|----|----|----|
| keys[] | P | M | | | A | C | S | H | L | | E | | | | R | X |
| vals[] | 10 | 9 | | | 8 | 4 | 0 | 5 | 11 | | 12 | | | | 3 | 7 |

after deleting S ?

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|--------|----|---|---|---|---|---|---|---|----|---|----|----|----|----|----|----|
| keys[] | P | M | | | A | C | | H | L | | E | | | | R | X |
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doesn't work, e.g., if $\text{hash}(H) = 4$



Linear Probing Hash Table

Deletion: What happens if we delete S from hash table?

before deleting S

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|--------|----|---|---|---|---|---|---|---|----|---|----|----|----|----|----|----|
| keys[] | P | M | | | A | C | S | H | L | | E | | | | R | X |
| vals[] | 10 | 9 | | | 8 | 4 | 0 | 5 | 11 | | 12 | | | | 3 | 7 |

after deleting S ?

| | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
|--------|----|---|---|---|---|---|---|---|----|---|----|----|----|----|----|----|
| keys[] | P | M | | | A | C | | H | L | | E | | | | R | X |
| vals[] | 10 | 9 | | | 8 | 4 | | 5 | 11 | | 12 | | | | 3 | 7 |

doesn't work, e.g., if $\text{hash}(H) = 4$

Cannot just leave **null/None** – will not find H

Need to rehash the cluster to the right of the deleted key.