# Algorithms and Data Structures 

Charles A. Wuethrich

Bauhaus-University Weimar - CogVis/MMC

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## Tables

- In general, a table is nothing else than a 2-dimensional array (or 3-D, or n-D) of data
- Data can be quite complex
- Access like in arrays is ruled through 2-dimensional indexes (up to n-D)


## Hash Tables

- Problem with arrays and lists: access not so easy if I search for a particular data and do not know its index
- Example: I know the data I want to look for, but do not know where it is
- I have to retrieve and read sequentially all data until I find the data I am looking for
- To overcome this problem, Hash Tables were invented
- Hash tables are used to store data in a large table


## Hash Tables

- A hash table is nothing else than a big table, where the access is ruled by a function called hash function
- For each data that has to be put in the table, the hash function computes a unique index that is used to insert the data in the table



## Hash Functions

- Hash tables are usually much bigger than the foreseen data I want to store in them
- A hash function $H$ is a transformation that takes a variablesize input $m$ and returns a fixed-size string, which is called the hash value $h$ (that is, $h=H(m)$ ).
- A fundamental property of all hash functions is that if two hashes (according to the same function) are different, then the two inputs were different in some way
- The hash value one gets is usually used to compute the index at the hash table where the data will be stored (or, if it is an integer, to compute it directly)


## Hash Functions

- However, while hash functions are injective, they are not a bijective function: I.e. given two inputs, the output of the hash function is not necessarily different
- If given two different data, the hash function computes the same value, then the hash function is said to generate a collision
- Obviously, it is important that the hash functions generates as little collisions as possible



## Hash Functions

- So what are good hash functions?
- Consider a table containing an index, a name, and a telephone number
- To search this table for Kurt, I would need to search through all of the names
- Which means, in worst case, to search N elements
- On average, I would have to search N/2 elements


## Hash Functions

- If I sort the names before, then I can do binary search
- That is, I visit
- first the place at $N / 2$,
- choose the side according to whether Kurt is smaller or biggerg of what I find at $N / 2$ - then visit $N / 4, \ldots$
- In this case, I still need $\log _{2} N$ to find the element, but I need a preprocessing step of $N \log N$

| Index | Name | Phone |
| :--- | :--- | :--- |
| 0 | Angus | 169278 |
| 1 | Carl | 314276 |
| 2 | Jason | 558293 |
| 3 | Kurt | 635951 |
| 4 | Leo | 239769 |
| 5 | Robert | 995386 |
| 6 | William | 834562 |
| 7 | Empty |  |
| $\ldots$ | Empty |  |
| N-1 | Empty |  | to do the sorting

- Any successive search will be $\log _{2} N$


## Hash Functions

- The idea behind hash functions is that one could use the data to compute the index I store my data at
- Suppose the global size of my table is 13
- Suppose I simply add the ASCII codes of the letters and obtain

| Index | S | S MOD 13 |
| :--- | :--- | :--- |
| Angus | 541 | 8 |
| Carl | 418 | 2 |
| Jason | 539 | 6 |
| Kurt | 454 | 12 |
| Leo | 320 | 8 |
| Robert | 654 | 4 |
| William | 751 | 10 | S

- And suppose I find the index as the S MOD 13
- Note: I use 13 because I always take prime numbers as the table size (more on it later), and my table size is 13


## Ascii codes

| Decimal | Hex | Char | Decimal | Hex | Char | Decimal | Hex | Char | Decimal | Hex | Char |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 0 | [NULL] | 32 | 20 | [SPACE] | 64 | 40 | @ | 96 | 60 | , |
| 1 | 1 | [START OF HEADING] | 33 | 21 | ! | 65 | 41 | A | 97 | 61 | a |
| 2 | 2 | [START OF TEXT] | 34 | 22 | " | 66 | 42 | B | 98 | 62 | b |
| 3 | 3 | [END OF TEXT] | 35 | 23 | \# | 67 | 43 | C | 99 | 63 | c |
| 4 | 4 | [END OF TRANSMISSION] | 36 | 24 | \$ | 68 | 44 | D | 100 | 64 | d |
| 5 | 5 | [ENQUIRY] | 37 | 25 | \% | 69 | 45 | E | 101 | 65 | e |
| 6 | 6 | [ACKNOWLEDGE] | 38 | 26 | \& | 70 | 46 | F | 102 | 66 | f |
| 7 | 7 | [BELL] | 39 | 27 | ${ }^{1}$ | 71 | 47 | G | 103 | 67 | g |
| 8 | 8 | [BACKSPACE] | 40 | 28 | 1 | 72 | 48 | H | 104 | 68 | h |
| 9 | 9 | [HORIZONTAL TAB] | 41 | 29 | $)$ | 73 | 49 | 1 | 105 | 69 | i |
| 10 | A | [LINE FEED] | 42 | 2A | * | 74 | 4A | J | 106 | 6 A | j |
| 11 | B | [VERTICAL TAB] | 43 | 2B | + | 75 | 4B | K | 107 | 6 B | k |
| 12 | C | [FORM FEED] | 44 | 2C | , | 76 | 4 C | L | 108 | 6 C | I |
| 13 | D | [CARRIAGE RETURN] | 45 | 2D | - | 77 | 4D | M | 109 | 6D | m |
| 14 | E | [SHIFT OUT] | 46 | 2E | . | 78 | 4E | N | 110 | 6 E | n |
| 15 | F | [SHIFT IN] | 47 | 2F | 1 | 79 | 4 F | 0 | 111 | 6 F | 0 |
| 16 | 10 | [DATA LINK ESCAPE] | 48 | 30 | 0 | 80 | 50 | $\mathbf{P}$ | 112 | 70 | p |
| 17 | 11 | [DEVICE CONTROL 1] | 49 | 31 | 1 | 81 | 51 | Q | 113 | 71 | q |
| 18 | 12 | [DEVICE CONTROL 2] | 50 | 32 | 2 | 82 | 52 | R | 114 | 72 | r |
| 19 | 13 | [DEVICE CONTROL 3] | 51 | 33 | 3 | 83 | 53 | S | 115 | 73 | 5 |
| 20 | 14 | [DEVICE CONTROL 4] | 52 | 34 | 4 | 84 | 54 | T | 116 | 74 | t |
| 21 | 15 | [NEGATIVE ACKNOWLEDGE] | 53 | 35 | 5 | 85 | 55 | U | 117 | 75 | u |
| 22 | 16 | [SYNCHRONOUS IDLE] | 54 | 36 | 6 | 86 | 56 | V | 118 | 76 | v |
| 23 | 17 | [ENG OF TRANS, BLOCK] | 55 | 37 | 7 | 87 | 57 | W | 119 | 77 | w |
| 24 | 18 | [CANCEL] | 56 | 38 | 8 | 88 | 58 | X | 120 | 78 | x |
| 25 | 19 | [END OF MEDIUM] | 57 | 39 | 9 | 89 | 59 | Y | 121 | 79 | y |
| 26 | 1A | [SUBSTITUTE] | 58 | 3 A | : | 90 | 5 A | Z | 122 | 7 A | z |
| 27 | 1B | [ESCAPE] | 59 | 3B | ; | 91 | 5B | [ | 123 | 7 B | $\{$ |
| 28 | 1 C | [FILE SEPARATOR] | 60 | 3C | $<$ | 92 | 5 C | 1 | 124 | 7 C | 1 |
| 29 | 1D | [GROUP SEPARATOR] | 61 | 3D | = | 93 | 5D | 1 | 125 | 7D | \} |
| 30 | 1E | [RECORD SEPARATOR] | 62 | 3E | $>$ | 94 | 5E | $\wedge$ | 126 | 7E | $\sim$ |
| 31 | 1 F | [UNIT SEPARATOR] | 63 | 3F | $?$ | 95 | 5 F | - | 127 | 7F | [DEL] |

## Hash Functions

- Now I fill in my 12 elements table exactly at the place said by S MOD 13

| Index | S | S MOD 13 |
| :--- | :--- | :--- |
| Angus | 541 | 8 |
| Carl | 418 | 2 |
| Jason | 539 | 6 |
| Kurt | 454 | 12 |
| Leo | 320 | 8 |
| Robert | 654 | 4 |
| William | 751 | 10 |


| Hash value | Name | Phone |
| :--- | :--- | :--- |
| 0 |  |  |
| 1 |  |  |
| 2 | Carl | 314276 |
| 3 |  |  |
| 4 | Robert | 995386 |
| 5 |  |  |
| 6 | Jason | 558293 |
| 7 |  |  |
| 8 | Angus -Leo | $169278-239769$ |
| 9 |  |  |
| 10 | William | 834562 |
| 11 |  |  |
| 12 | Kurt | 635951 |

## Collision! \#?@\#\%\&!!!!

## Hash Functions

- And now ?!


## Hash Functions

- There are alternative strategies that can be taken:
- The simplest one would be to look if the next cell is free,
- if it is, store the data there,
- if not, look forward
- This approach is called open addressing
- A smarter version of this approach sets a chained list at each hash table position.
- This approach is called bucketing, because at each position you have a bucket containing some elements instead of a single element


## Hash Functions

- Another approach is to use a second hash function H 2 for handling collisions (double hashing)
- Obviously, the second function needs to be completely different from the first one
- For example, take one plus the bitwise exclusive or of all codes in a name (again taken as all lowercase) $\bmod \mathrm{N}$, where N is the size of the hash table
- If the first hash function $H_{1}$ gives a collision, use the second hash function $H_{2}$ to generate a new hash index, and add it $(\bmod \mathrm{N})$ to the result of $H_{1}$


## Hash Functions

- Why do we usually take hash tables with prime numbers?
- The reasons are deeply rooted in math: given a cyclic group $Z_{p}$, with p prime, then any element a of $Z_{p}$ is a generator of the group
- In other words, the sums $a,(a+a),(a+a+a), \ldots$ are such that after $p$ sums I reobtain a, and the sums have covered ALL elements of $Z_{p}$.


## Hash Functions

- What are the advantages of a hash table?
- First and foremost, it takes ONE application of the hash function to generically find an element of my table
- Obviously, the more a hash table is filled, the more collisions one gets.
- At some point of filling, it might be a good idea to enlarge the hash table and use another hash function, of course, better suited for the larger table

