

Motivation

11. Hash Tables

Hash Tables, Birthday Paradoxon, Hash functions, Resolving Collisions with Chaining, Open Addressing, Probing

Goal: Table of all n students of this course

Requirement: fast access by name or legi-nr

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Motivation : Legi \leftrightarrow Name ?

Fabian 55-994-231	Daniel 83-938-208	Jessica 55-624-546	Tamara 29-96-200	Ute 18-327-852	Kerstin 48-289-314	Luuk 44-703-302	Enrico 37-269-245	Saskia 25-510-11
Joshua 49-614-560	Luca 56-688-72	Kim 88-657-140	Antoine 24-856-162	Odysseas 38-852-388	Nicolas 53-935-647	Ricco 49-331-393	Cem 82-13-491	Lucas 59-406-11
Julian 81-178-251	Daniel 53-429-224	Malou 22-475-778	Julian 52-224-654	Zabolcs 48-950-187	Hannah 58-891-305	Josianne 47-450-1	Sandrine 45-501-180	Sandra 45-501-180
Jonas 20-616-884	Irene 55-855-940	Rebecca 70-312-182	Miriam 18-128-921	Nicolas 16-470-617	Victor 49-715-730	Leandro 25-506-223	Maria 49-518-593	Giovanni 30-778-190
Katinka 33-668-7926-109	Ascha 49-698-913	Christof 58-722-624	Rajisun 58-357-886	Sabrina 63-217-14994	Yannick 75-632-926-228	Stefano 77-264-295	Nastassja 59-708-899	Giorgio 49-558-111
Raphael 49-698-913	Colo 34-112-2513	Florian 43-227-798	Corina 49-81-976	Christina 22-609-138-362	Noémie 43-537-576	Danielle 26-264-295	Bernard 30-634-295	Eleanor 26-679-744
Elie 45-452-209	Violette 45-620	Michael 10-831-85	Lorenz 75-274-84	Marvin 10-741-49	Marvin 49-822-450	David 30-634-295	Lucas 83-351-395	Sven 91-806-640
Fabian 34-112-2513	Natalie 43-227-798	Florian 49-81-976	Flory 21-908-228	Marvin 10-831-85	Marvin 43-537-576	Danielle 26-264-295	Bernard 30-634-295	Eleanor 26-679-744
Andrea 45-452-209	Alice 45-620	Michael 10-831-85	Lorenz 75-274-84	Marvin 10-741-49	Marvin 49-822-450	David 30-634-295	Lucas 83-351-395	Sven 91-806-640

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Table: Legi \rightarrow Name

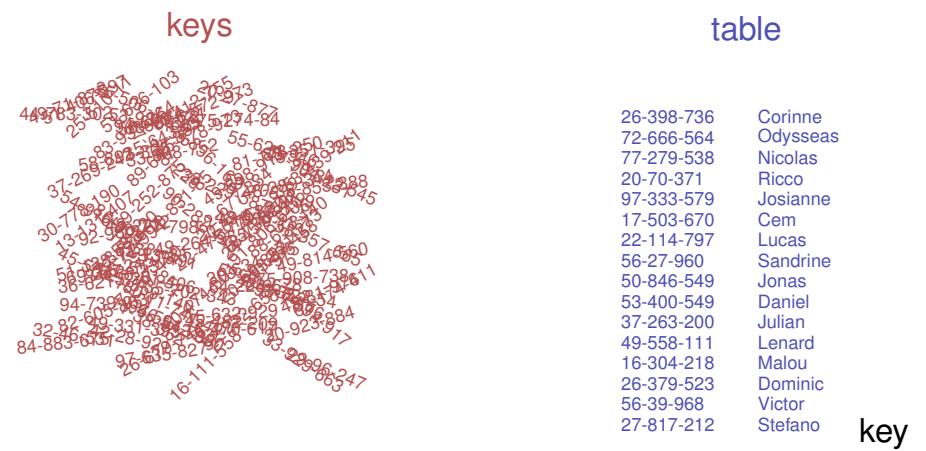


Table: Name → Legi

keys	table																																
	<table border="1"> <tbody> <tr><td>Jessica</td><td>70-534-949</td></tr> <tr><td>Antoine</td><td>71-875-287</td></tr> <tr><td>Tamara</td><td>44-366-474</td></tr> <tr><td>Jérôme</td><td>13-645-632</td></tr> <tr><td>Joël</td><td>29-242-212</td></tr> <tr><td>Kerstin</td><td>69-826-960</td></tr> <tr><td>Enrico</td><td>25-506-11</td></tr> <tr><td>Saskia</td><td>18-441-662</td></tr> <tr><td>Joshua</td><td>96-77-509</td></tr> <tr><td>Gianluca</td><td>78-899-25</td></tr> <tr><td>Davide</td><td>10-239-900</td></tr> <tr><td>Kim</td><td>54-277-635</td></tr> <tr><td>Raffael</td><td>17-605-302</td></tr> <tr><td>Corinne</td><td>61-836-416</td></tr> <tr><td>Odysseas</td><td>26-679-744</td></tr> <tr><td>Nicolas</td><td>62-365-358</td></tr> </tbody> </table> <p>key</p>	Jessica	70-534-949	Antoine	71-875-287	Tamara	44-366-474	Jérôme	13-645-632	Joël	29-242-212	Kerstin	69-826-960	Enrico	25-506-11	Saskia	18-441-662	Joshua	96-77-509	Gianluca	78-899-25	Davide	10-239-900	Kim	54-277-635	Raffael	17-605-302	Corinne	61-836-416	Odysseas	26-679-744	Nicolas	62-365-358
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universe: conceptually infinitely many possible key values

Plan

- First, we consider a strategy for a mapping key set (legi nr or name) → indices (integers)
Such a function we call a *hash function*.
- Then we limit the range of values of the hash-function
key set (legi nr or name) → $\{0, \dots, m - 1\}$.
Using this, we can implement a *hash table* based on an array.
- as a consequence, there will be *collisions*. We think about the probabilities of a collision and how many collisions we expect.
- Finally, we clarify how collisions can be handled.

Naive Ideas

Mapping Name $s = s_1s_2 \dots s_{l_s}$ to key

$$k(s) = \sum_{i=1}^{l_s} s_i \cdot b^i$$

b large enough such that different names map to different keys.

Store each data set at its index in a huge array.

Example with $b = 100$. Ascii-Values s_i .

Anna $\mapsto 71111065$

Jacqueline $\mapsto 102110609021813999774$

Unrealistic: requires too large arrays.

Better idea?

Allocation of an array of size m ($m > n$).

Mapping Name s to

$$k_m(s) = \left(\sum_{i=1}^{l_s} s_i \cdot b^i \right) \bmod m.$$

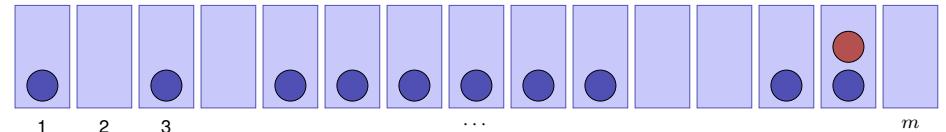
Different names can map to the same key ("Collision"). And then?

Estimation

Maybe collision do not really exist? We make an estimation ...

Estimation

Assumption: m urns, n balls (wlog $n \leq m$).
 n balls are put uniformly distributed into the urns



What is the collision probability?

Very similar question: with how many people (n) the probability that two of them share the same birthday ($m = 365$) is larger than 50%?

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[Estimation]

$$\mathbb{P}(\text{no collision}) = \frac{m}{m} \cdot \frac{m-1}{m} \cdot \dots \cdot \frac{m-n+1}{m} = \frac{m!}{(m-n)! \cdot m^n}.$$

Let $a \ll m$. With $e^x = 1 + x + \frac{x^2}{2!} + \dots$ approximate $1 - \frac{a}{m} \approx e^{-\frac{a}{m}}$.
This yields:

$$1 \cdot \left(1 - \frac{1}{m}\right) \cdot \left(1 - \frac{2}{m}\right) \cdot \dots \cdot \left(1 - \frac{n-1}{m}\right) \approx e^{-\frac{1+\dots+n-1}{m}} = e^{-\frac{n(n-1)}{2m}}.$$

Thus

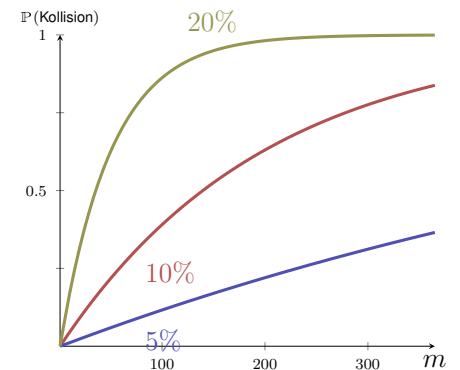
$$\mathbb{P}(\text{Kollision}) = 1 - e^{-\frac{n(n-1)}{2m}}.$$

Puzzle answer: with 23 people the probability for a birthday collision is 50.7%. Derived from the slightly more accurate Stirling formula.

With filling degree:

With filling degree $\alpha := n/m$ it holds that (simplified further)

$$\mathbb{P}(\text{collision}) \approx 1 - e^{-\alpha^2 \cdot \frac{m}{2}}.$$

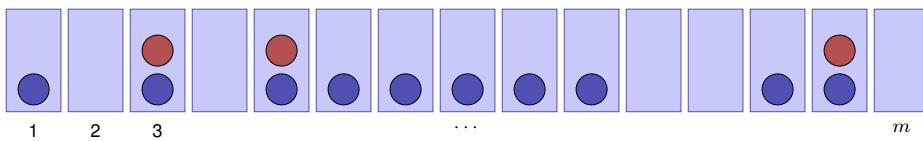


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Different Question

Assumption: m urns, n balls (wlog $n \leq m$).
 n balls are put uniformly distributed into the urns



What is the expected number of collisions?

Expected Number Collisions

- $\mathbb{P}(\text{Kugel } B \text{ trifft Kugel } A_i) = 1/m.$
 - $\mathbb{P}(\text{Kugel } B \text{ trifft Kugel } A_i \text{ nicht}) = 1 - 1/m.$
 - $\mathbb{P}(n-1 \text{ Kugeln treffen } A_i \text{ nicht}) = (1 - 1/m)^{n-1}.$
 - $\mathbb{P}(A_i \text{ getroffen}) = 1 - (1 - 1/m)^{n-1}.$
 - Sei X_i Zufallsvariable mit $X_i = \mathbb{1}_{A_i \text{ getroffen}}$
 - $\mathbb{E}(\sum X_i) = \sum \mathbb{E}(X_i)$
 - $\mathbb{E}(\text{Anzahl getroffene Kugeln}) = n(1 - (1 - 1/m)^n) \approx \frac{n^2}{2m}.$

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Nomenclature

Hash function h : Mapping from the set of keys \mathcal{K} to the index set $\{0, 1, \dots, m - 1\}$ of an array (**hash table**).

$$h : \mathcal{K} \rightarrow \{0, 1, \dots, m - 1\}.$$

Normally $|\mathcal{K}| \gg m$. There are $k_1, k_2 \in \mathcal{K}$ with $h(k_1) = h(k_2)$ (**collision**).

A hash function should map the set of keys **as uniformly as possible** to the hash table.

Implementation Hashfunktion (String) in Java

$$h_{b,m}(s) = \left(\sum_{i=0}^{l-1} s_i \cdot b^i \right) \bmod m$$

```
int ComputeHash(int m, String s) {  
    int sum = 0;  
    int b = 1;  
    for (int k = 0; k < s.length(); ++k){  
        sum = (sum + s.charAt(k) * b) % m;  
        b = (b * 31) % m;  
    }  
    return sum;  
}
```

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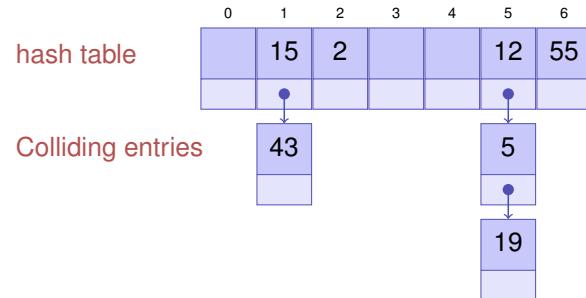
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Resolving Collisions

Example $m = 7$, $\mathcal{K} = \{0, \dots, 500\}$, $h(k) = k \bmod m$.

Keys 12 , 55 , 5 , 15 , 2 , 19 , 43

Chaining the Collisions

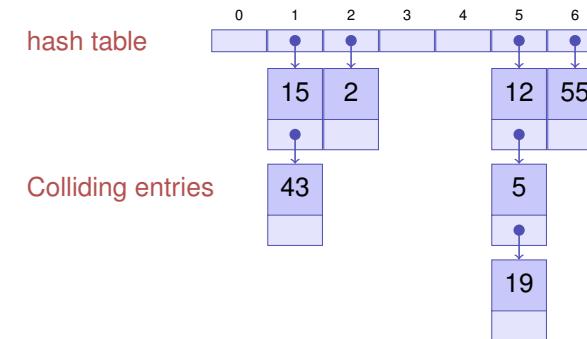


Resolving Collisions

Example $m = 7$, $\mathcal{K} = \{0, \dots, 500\}$, $h(k) = k \bmod m$.

Keys 12 , 55 , 5 , 15 , 2 , 19 , 43

Direct Chaining of the Colliding entries



Algorithm for Hashing with Chaining

- **contains(k)** Search in list from position $h(k)$ for k . Return true if found, otherwise false.
- **put(k)** Check if k is in list at position $h(k)$. If no, then append k to the end of the list. Otherwise error message.
- **get(k)** Check if k is in list at position $h(k)$. If yes, return the data associated to key k , otherwise error message.
- **remove(k)** Search the list at position $h(k)$ for k . If successful, remove the list element.

Advantages and Disadvantages

Advantages

- Possible to overcommit: $\alpha > 1$
- Easy to remove keys.

Disadvantages

- Memory consumption of the chains-

Open Addressing

Store the colliding entries directly in the hash table using a *probing function* $s(j, k)$ ($0 \leq j < m, k \in \mathcal{K}$)

Key table position along a *probing sequence*

$$S(k) := ((h(k) + s(0, k)) \bmod m, \dots, (h(k) + s(m-1, k)) \bmod m)$$

Algorithms for open addressing

- `contains`(k) Traverse table entries according to $S(k)$. If k is found, return true. If the probing sequence is finished or an empty position is reached, return false.
- `put`(k) Search for k in the table according to $S(k)$. If k is not present, insert k at the first free position in the probing sequence. Otherwise error message.
- `get`(k) Traverse table entries according to $S(k)$. If k is found, return data associated to k . Otherwise error message.
- `remove`(k) Search k in the table according to $S(k)$. If k is found, replace it with a special `removed` key.

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Linear Probing

$$\begin{aligned} s(j, k) &= j \Rightarrow \\ S(k) &= (h(k) \bmod m, (h(k) + 1) \bmod m, \dots, (h(k) - 1) \bmod m) \end{aligned}$$

Example $m = 7, \mathcal{K} = \{0, \dots, 500\}, h(k) = k \bmod m$.

Key 12, 55, 5, 15, 2, 19

0	1	2	3	4	5	6
5	15	2	19		12	55

Deletion with Open Addressing

- An empty slot determines the end of a probing sequence.
- If an element is removed by emptying the respective slot, a probing sequence could be interrupted.
- Therefore a special entry “removed” is used in order to specify that the probing sequence does not necessarily end but the slot is still considered empty.

Example: remove entry 55 at index 6:

0	1	2	3	4	5	6
5	15	2	19		12	(r)

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Discussion

Example $\alpha = 0.95$

The unsuccessful search considers 200 table entries on average!

② Disadvantage of the method?

! *Primary clustering*: similar hash addresses have similar probing sequences \Rightarrow long contiguous areas of used entries.

Discussion

Example $\alpha = 0.95$

Unsuccessfully search considers 22 entries on average

② Problems of this method?

! *Secondary clustering*: Synonyms k and k' (with $h(k) = h(k')$) travers the same probing sequence.

Quadratic Probing

$$s(j, k) = \lceil j/2 \rceil^2 (-1)^{j+1}$$

$$S(k) = (h(k), h(k) + 1, h(k) - 1, h(k) + 4, h(k) - 4, \dots) \bmod m$$

Example $m = 7, \mathcal{K} = \{0, \dots, 500\}, h(k) = k \bmod m$.

Keys 12, 55, 5, 15, 2, 19

0	1	2	3	4	5	6
19	15	2		5	12	55

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Double Hashing

Two hash functions $h(k)$ and $h'(k)$. $s(j, k) = j \cdot h'(k)$.

$$S(k) = (h(k), h(k) + h'(k), h(k) + 2h'(k), \dots, h(k) + (m-1)h'(k)) \bmod m$$

Example:

$m = 7, \mathcal{K} = \{0, \dots, 500\}, h(k) = k \bmod 7, h'(k) = 1 + k \bmod 5$.

Keys 12, 55, 5, 15, 2, 19

0	1	2	3	4	5	6
5	15	2	19		12	55

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Double Hashing

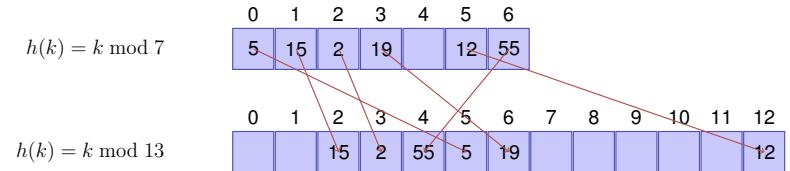
- Probing sequence must permute all hash addresses. Thus $h'(k) \neq 0$ and $h'(k)$ may not divide m , for example guaranteed with m prime.
- h' should be independent of h (avoiding secondary clustering)

Unabhängigkeit gilt zum Beispiel, wenn $h(k) = k \bmod m$ and
 $h'(k) = 1 + k \bmod (m - 2)$, m Primzahl.

Dynamic Hash Tables

- When a hashtable has to grow during runtime, its content has to be copied into a new table.
- The hash function changes; each entry of the old hash table needs to be re-allocated (“re-hashing”).

example (with linear probing):



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Generic Hashtables in Java `java.util.HashMap`

```
import java.util.HashMap;
...
// Map String --> Integer
HashMap<String, Integer> map = new HashMap<String, Integer>();

map.put("abc", 3);
map.put("xyz", 100);
int i = map.get("abc"); // i = 3
int j = map.get("xyz"); // j = 100
```

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