



Symbol Table and Hashing

- (Symbol) **table** is a set of table entries, (k, v)
- Each entry contains:
 - a unique key, k , and
 - a value (information), v
- Each key uniquely identifies its entry
- Table searching:
 - **Given**: a search key, k
 - **Find**: the table entry, (k, v)

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Symbol Table and Hashing

- Once the entry (k, v) is found:
 - its value v , may be updated,
 - it may be retrieved, or
 - the entire entry, (k, v) , may be removed from the table
- If no entry with key k exists in the table:
 - a new entry with k as its key may be inserted to the table
- **Hashing**:
 - a technique of storing values in the tables and
 - searching for them in linear, $O(n)$, worst-case and extremely fast, $O(1)$, average-case time

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Basic Features of Hashing

- **Hashing** computes an integer, called the **hash code**, for each object
- The computation is called the **hash function**, $h(k)$
 - It maps objects (e.g., keys k) to the array indices (e.g., 0, 1, ..., i_{\max})
- An object with a key k has to be stored at location $h(k)$
 - The hash function must always return a valid index for the array

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Basic Features of Hashing

- **Perfect hash function** \rightarrow a different index value for every key. But such a function cannot be always found.
- **Collision**: if two distinct keys, $k_1 \neq k_2$, map to the same table address, $h(k_1) = h(k_2)$
- **Collision resolution policy**: how to find additional storage to store one of the collided table entries
- **Load factor** λ - fraction of the already occupied entries (m occupied entries in the table of size $n \rightarrow \lambda = m/n$)

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How Common Are Collisions?

- **Von Mises Birthday Paradox**:
 - if there are more than **23** people in a room, the chance is greater than **50%** (!) that **two** or more of them will have the same birthday
- In the only 6.3% full table (since $23/365 = 0.063$) there is better than 50% chance of a collision!
 - Therefore: 50% chance of collision if $\lambda = 0.063$

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How Common Are Collisions?

- **Probability $Q_N(n)$ of no collision**:
 - that is, that none of the n items collides, being randomly tossed into a table with N slots:

$$Q_N(1) = 1 = \frac{N}{N}; \quad Q_N(2) = Q_N(1) \frac{N-1}{N} = \frac{N(N-1)}{N^2};$$

$$Q_N(3) = Q_N(2) \frac{N-2}{N} = \frac{N(N-1)(N-2)}{N^3}; \quad \dots$$

$$Q_N(n) = Q_N(n-1) \frac{N-n+1}{N} = \frac{N(N-1)\dots(N-n+1)}{N^n}$$

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Probability $P_N(n)$ of One or More Collisions

$$P_N(n) = 1 - Q_N(n) = 1 - \frac{N!}{N^n(N-n)!}$$

n	%	$P_{365}(n)$
10	2.7	0.1169
20	5.5	0.4114
30	8.2	0.7063
40	11.0	0.8912
50	13.7	0.9704
60	16.4	0.9941

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Open Addressing with Linear Probing (OALP)

- The simplest collision resolution policy:
 - Successive search for the first empty entry at a lower location
 - If no such entry, then "wrap around" the table
- Lemma 3.33:** The average number of probes for successful, $T_{ss}(\lambda)$, and unsuccessful, $T_{us}(\lambda)$, search in a hash table with load factor $\lambda = m/n$ is, respectively,

$$T_{ss}(\lambda) = 0.5 \left(1 + \frac{1}{1-\lambda} \right) \text{ and } T_{us}(\lambda) = 0.5 \left(1 + \left(\frac{1}{1-\lambda} \right)^2 \right)$$
- Drawbacks:** clustering of keys in the table

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OALP example:

$n = 5..7$
 $N = 10$

Pairs [key,value]	Hash code: key/10	Table address
[20, A]	$h(20) = 2$	2
[15, B]	$h(15) = 1$	1
[45, C]	$h(45) = 4$	4
[87, D]	$h(87) = 8$	8
[39, E]	$h(39) = 3$	3
[31, F]	$h(31) = 3$	3

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Open Addressing with Double Hashing (OADH)

- Better collision resolution policy reducing the clustering:
 - hash the collided key again with a different hash function
 - use the result of the second hashing as an increment for probing table locations (including wraparound)
- Lemma 3.35:** Assuming that OADH provides nearly uniform hashing, the average number of probes for successful, $T_{ss}(\lambda)$, and unsuccessful, $T_{us}(\lambda)$, search is, respectively,

$$T_{ss}(\lambda) = \frac{1}{\lambda} \ln \left(\frac{1}{1-\lambda} \right) \text{ and } T_{us}(\lambda) = \frac{1}{1-\lambda}$$

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Two More Collision Resolution Techniques

- Open addressing has a problem if significant number of items need to be deleted:
 - Logically deleted items must remain in the table until the table can be re-organised
- Two techniques to attenuate this drawback:
 - Chaining
 - Hash bucket

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Chaining and Hash Bucket

- **Chaining:** all keys collided at a single hash address are placed on a linked list, or chain, started at that address
- **Hash bucket:** a big hash table is divided into a number of small sub-tables, or buckets
 - the hash function maps a key into one of the buckets
 - the keys are stored in each bucket sequentially in increasing order

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Choosing a hash function

- **Four basic methods:**
 - division, folding, middle-squaring, and truncation
- **Division:**
 - choose a prime number as the table size n
 - convert keys, k , into integers
 - use the remainder $h(k) = k \bmod n$ as a hash value of k
 - get the double hashing decrement using the quotient

$$\Delta k = \max\{1, (kn) \bmod n\}$$

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Choosing a hash function

- **Folding:**
 - divide the integer key, k , into sections
 - add, subtract, and / or multiply them together for combining into the final value, $h(k)$
 - Ex.: $k = 013402122 \rightarrow 013, 402, 122 \rightarrow h(k) = 013 + 402 + 122 = 537$
- **Middle-squaring:**
 - choose a middle section of the integer key, k
 - square the chosen section
 - use a middle section of the result as $h(k)$
 - Ex.: $k = 013402122 \rightarrow \text{mid: } 402 \rightarrow 402^2 = 161404 \rightarrow \text{mid: } h(k) = 6140$

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Choosing a hash function

Truncation:

- delete part of the key, k
- use the remaining digits (bits, characters) as $h(k)$

Example:
 $k = 013402122 \rightarrow \text{last 3 digits: } h(k) = 122$

- Notice that truncation does not spread keys uniformly into the table; thus it is often used in conjunction with other methods

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Efficiency of Search in Hash Tables

Load factor λ : if a table of size n has exactly m occupied entries, then $\lambda = m/n$

- Average numbers of probe addresses examined for a successful ($T_{ss}(\lambda)$) and unsuccessful ($T_{us}(\lambda)$) search:

	OALP: $\lambda < 0.7$	OADH: $\lambda < 0.7$	SC
$T_{ss}(\lambda)$	$0.5(1 + 1/(1-\lambda))$	$(1/\lambda)\ln(1/(1-\lambda))$	$1 + \lambda/2$
$T_{us}(\lambda)$	$0.5(1 + (1/(1-\lambda))^2)$	$1/(1-\lambda)$	λ

SC – separate chaining; λ may be higher than 1

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Table Data Type Representations: Comparative Performance

Operation	Representation		
	Sorted array	AVL tree	Hash table
Initialize	$O(n)$	$O(1)$	$O(n)$
Is full?	$O(1)$	$O(1)$	$O(1)$
Search*)	$O(\log n)$	$O(\log n)$	$O(1)$
Insert	$O(n)$	$O(\log n)$	$O(1)$
Delete	$O(n)$	$O(\log n)$	$O(1)$
Enumerate	$O(n)$	$O(n)$	$O(n \log n)$ ***)

*) also: **Retrieve, Update** ***) To enumerate a hash table, entries must first be sorted in ascending order of keys that takes $O(n \log n)$ time

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