

# PRINCIPLES OF DATA ORGANISATION

Hashing Introduction



# MOTIVATION

- ↳ Index
  - ↳ Give (artificial) ID – get position of the record in the primary file
- ↳ Direct access ~ equality query
  - ↳ Not for range queries



# HASHING

- ↳ Also known as direct accessing, randomizing
- ↳ Hashing is a technique capable of accessing a record in memory in **O(1)** time by using **hash functions**
  - Maps search **keys** to (physical or logical) **addresses** (buckets)
- ↳ Hash function is a mapping from the **query space** to the **address space**  
 $h : K^* \rightarrow \{0, 1, \dots, M - 1\}$ 
  - Query space = the space of all possible values of the query key
    - Ex. Name, address, age, ...
  - Usually: address space  $\ll$  query space
- ↳  **$h(k)$**  determines the address of a record with a key  **$k$**



# HASH FUNCTION

❧ A good hash function should have:

❧ **Uniform distribution:** Each bucket should contain keys from all parts of the address space

❧ Distributes the values evenly across buckets

❧ All buckets are expected to contain a roughly equal number of hash values

❧ There are no unused buckets

❧ **Random distribution:** Each bucket should be equally filled regardless of the key value distribution

❧ The result should be dependent on all bits of the key

❧ A good hash function should be:

❧ **Deterministic:** the resulting value is dependent only on the input values

❧ For the same key we get the same address

❧ **Fast:** it should take only few instructions to compute the resulting value of the hash function

❧ Usually an algorithm evaluates the function

❧ A bad function

❧ would map all the search keys onto the same address  
search = sequential scan



# HASH FUNCTIONS – TRIVIAL

- ❧ The numerical representation of the key represents the relative (or absolute) address
  - ❧ A small number of values that fit into the (primary memory) address space
- ❧ Advantages:
  - ❧ fast
  - ❧ **perfect** (no collisions)
- ❧ Disadvantages:
  - ❧ usable only for relatively small domains
  - ❧ commonly neither uniform nor random
    - Depends on the distribution of the values of the keys
- ❧ Examples:
  - ❧ 32-bit integer values – can directly represent the bucket index
  - ❧ 26 letters → 3-letter codes can be uniquely mapped into  $26^3 = 17576$ -long array



# HASH FUNCTIONS – MODULO

⌘  $h(k) = k \bmod M$

⌘ For  $M = 16$  value of  $h(k)$  is dependent solely on the 4 low-order (least significant) bits of the key

⌘ These bits can be poorly distributed, which can lead to poor distribution of the results  
⌘ i.e. lots of collisions

⌘  $M$  is advised to be a **prime number**



# HASH FUNCTIONS — BINNING

⌘  $h(k) = k / M$

⌘ We need to know the range of the domain

⌘ Can be seen as an inverse to modulo since it looks at the high-order bits

⌘ If the distribution of the high-order bits is poorly distributed, so will the results

⌘ For  $M = 100$  and domain range  $< 0; 1000 >$

⌘ values  $< 0; 99 >$  will go to the first slot

● values  $< 100; 199 >$  will go to the second slot

● ...



# HASH FUNCTIONS — MID-SQUARE

- ☞ Squares the key value, and then takes the middle  $r$  bits of the result, giving a value in the range  $\langle 0; 2^{r-1} \rangle$
- ☞ Good to use with integers
- ☞ Is not dependent on the distribution of low- or high-order bits – all bits contribute to the final value
  - ☞ In the previous two cases, a change of some bits has no impact

$$r = 2, k = 4567 \rightarrow 4567^2 = 20857489 \rightarrow h(k) = 57$$

$$\begin{array}{r} 4567 \\ \underline{4567} \\ 31969 \\ 27402 \\ 22835 \\ \underline{18268} \\ 20857489 \end{array}$$



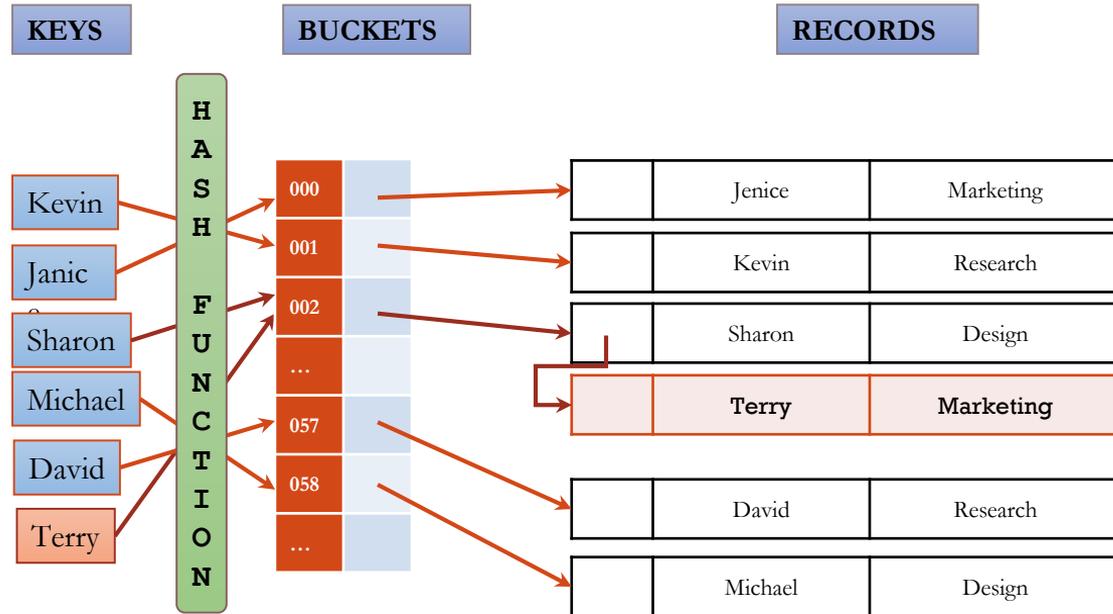
# INTERNAL HASHING

- ⌘ Hashing structure fits **in main memory** ~ limited space
- ⌘ **Each bucket contains one record**
  - ⌘ Basically associative array
- ⌘ Hash table utilises a hash function (map) to match the keys with their associated values
- ⌘ If multiple keys are mapped to the same position ~ **collision**
- ⌘ Hash tables vary in collision handling
  - I. Separate chaining/hashing
  - II. Open addressing
  - III. Coalesced chaining/hashing
  - IV. Cuckoo hashing



# I. SEPARATE CHAINING

Buckets contain links to chains of collided records

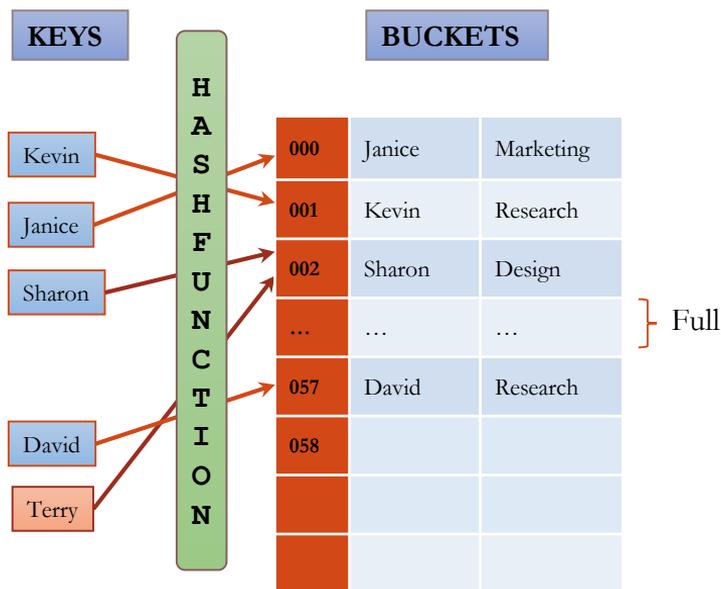


Different part of the main (primary) memory!!



# II. OPEN ADDRESSING

Collided record is inserted into the next free bucket (basic version)



Searching for a record with key  $K$ :

1. compute the address  $A$  from the query key  $K$  using the hash function
2. if no record is present at  $A$ , the searched record is not in the table
3. Otherwise, scan (see the following slides) the table **until either record with key  $K$  is found (record found) or an empty slot is encountered (record not present)**

Example:

- $\text{hash}(\text{Terry}) = 002 \rightarrow$  collision
- Use for Terry the next free bucket: **058**
- $\text{hash}(\text{Michael}) = 058 \rightarrow$  collision
- Use for Michael the next free bucket



## II. OPEN ADDRESSING — PROBE FUNCTION

Next bucket is determined by a probe sequence generated by a **probe function**.  
The function should also keep a track of whether it did not get into a cycle.

```
void insert(const Key& k, const Record& r)
{
    int home;                // Home position for k
    int pos = home = h(k);   // Init probe sequence
    int i = 0;
    while (HT[pos].key() != EMPTYKEY) {
        i++;
        pos = (home + p(k, i)) % M;    // probe function
        if (k == HT[pos].key()) {
            cout << "Duplicates not allowed\n";
            return;
        }
    }
    HT[pos] = r;
}
```



# II. OPEN ADDRESSING — PROBE FUNCTION

## Clustering

- ❧ When sequentially scanning for a next free slot, the probe sequences can collide and thus cause clustering
  - ❧ Long sequence for receiving a record
- ❧ Optimal probe function should provide each slot with an equal probability of receiving a record
  - ❧ It should cycle through all slots in the hash table before returning to the home position.



# II. OPEN ADDRESSING – PROBE FUNCTIONS

## Linear probing

- 🔗  $p(k,i) = c * i$
- 🔗  $c$  and  $M$  should share no factors
  - 🔗  $M$  – the size of address space
- 🔗  $i$  – the number of failed attempts to find an empty bucket
- 🔗  $c = 1$  ... try the next bucket

## Quadratic probing

- 🔗  $p(k,i) = (c_1 i + c_2 i^2)$
- 🔗 Wrong choice of constants can prevent from visiting every slot
- 🔗 There exists a fitting choice of the constants
  - 🌸  $c_1 = 0, c_2 = 1$   
 $M = \text{prime number}$
  - 🌸 At least half slots will be visited
  - 🌸  $c_1 = \frac{1}{2}, c_2 = \frac{1}{2}$   
 $M = \text{power of } 2$
  - 🌸 Every slot will be visited

## (Pseudo-)random probing

- 🔗  $p(k,i) = \text{perm}[i]$
- 🔗  $\text{perm}$  is a pre-defined table with permutations of length  $M$

## Double hashing

- 🔗  $p(k,i) = i * g(k)$
- 🔗 The probe sequence is now different for different keys



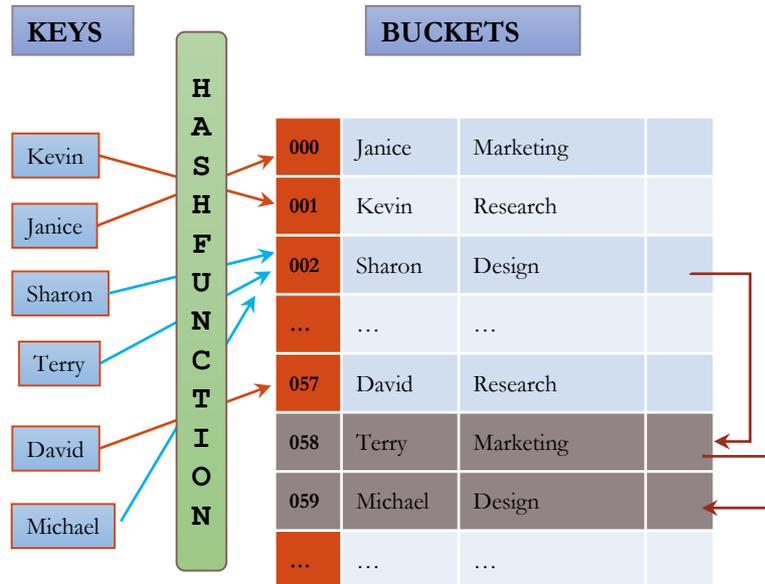
# III. COALESCED CHAINING

- ↳ Combines separate chaining and open addressing
  - ↳ The chains are stored in the hash table
- ↳ When a collision occurs, the new value is stored to the first free bucket from the end of the table
- ↳ The end of the chain is connected to this new value
- ↳ Collided records are chained to decrease the retrieval time
  - ↳ For both insert and query operations
- ↳ Two chains never merge (as probe sequences can)



# III. COALESCED CHAINING

Combines separate chaining and open addressing  
Two chains never merge (as probe sequences can)



# IV. CUCKOO HASHING

Two hash functions  $h_1, h_2$

- ⌘ No overflow chains or scanning of the hash table
- ⌘ If  $h_1(k)$  is full, insert the record anyway and **kick the residing record** ( $k'$ ) into its alternative location  $h_2(k')$ 
  - ⌘ If  $h_2(k')$  is full, repeat the strategy until a new position is found or the process is too long
  - ⌘ If too long, choose new functions and rebuild (rehash) the structure
- ⌘ Often implemented by 2 tables each having its own hash function
  - ⌘ Values move between the tables



# IV. CUCKOO HASHING — EXAMPLE

Insert Z :  $h_1(Z) = 7, h_2(Z) = 0$  (positions in the table)

The graph shows the insertion “chain”

~~⊗~~ Z → W  
~~⊗~~ W → H  
~~⊗~~ H → Z  
~~⊗~~ Z → A  
~~⊗~~ A → B  
~~⊗~~ B → empty

~~⊗~~ Insert:  
~~⊗~~ Worst case complexity:  $O(n)$   
~~⊗~~ Amortized:  $O(1)$   
~~⊗~~ Look-up, delete:  $O(1)$

<https://programming.guide/cuckoo-hashing.html>

