

HASHING



Algorithms and Data Structures 2
Exercise – 2021W

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HASHING :: MOTIVATION

Initial problem example: Storage of 100 student IDs for an exam with direct access.

- Array with a size of 100 million elements would be necessary for direct access (00 000 000 – 99 999 999).
- Remedy: Map the keys to the desired range (e.g., index 0 - 99).
- Problem: Mapping is not unambiguous → handling of collisions.

Aim

- Map keys to specific value range so that elements in the list can be accessed using an index.
- **Best case $O(1)$.**

Hashing: Compromise between time and memory requirements

- No time problem: sequential search.
- No memory problem: use keys as memory addresses.

HASHING :: PRINCIPLE

Algorithms based on hashing consist basically of 2 parts:

1. Transformation of key k (must be unique) into a table address (from the set of possible hashes K)

$h: k \rightarrow \{0, \dots, N-1\}$... N should be a prime number (\rightarrow equal distribution)

Perfect/Injective hashing:

$|K| \geq$ number of search keys k to be stored

$|K| \leq$ number N of available memory cells

2. Collision avoidance

- Transformation might result in same index for different keys
- Store elements at different positions

HASHING :: PRINCIPLE

For this exercise we use the modulo operation (%) as hash function.

- However, it is also possible to define other hash functions...
- $h(k) = k \% N$

Example

- Hash table ($n = 7$), in which Integer values are stored

0	1	2	3	4	5	6

- *insert(11)*: $h(11) = 11 \% 7 = 4 \rightarrow$ insert 11 at index position 4

0	1	2	3	4	5	6
				11		

HASHING :: PRINCIPLE

Example (cont'd):

- insert(27): $h(27) = 27 \% 7 = 6$


0	1	2	3	4	5	6
				11		27

- insert(21): $h(21) = 21 \% 7 = 0$

0	1	2	3	4	5	6
21				11		27

- insert(18): $h(18) = 18 \% 7 = 4$

0	1	2	3	4	5	6
21				11		27



→ at position 4 there is already an entry (collision)
→ different strategies for collision avoidance

HASHING :: RESOLVING COLLISIONS

1. Chaining

Overflow chains are attached at the corresponding index positions. Each element is a reference to an overflow chain:

- Table can never overflow.
- Long chains behave like list processing without direct access (→ worse performance).
- Searching of a key:
 - Calculate $h(k)$ and search until the end of the corresponding chain is reached.
- Insertion of a key:
 - Calculate $h(k)$ and append to the end of the corresponding chain.
- Removal of a key:
 - Search and remove from list if found.

Example

- Insert of 11, 27, 21, 18, 32, 44, 55 in hash table

HASHING :: CHAINING

insert: 11, 27, 21, 18, 32, 44, 55

Hash values

k

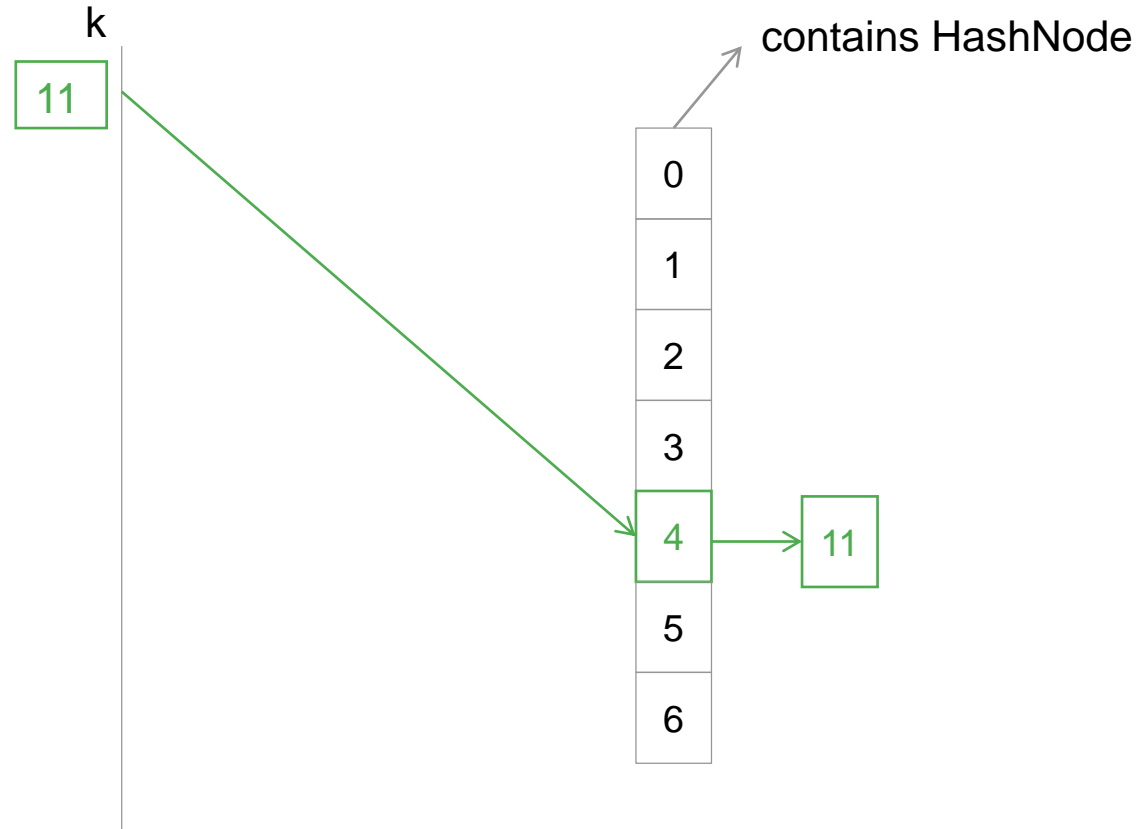
contains HashNode



```
HashNode {  
    Integer key  
    HashNode next  
}
```

HASHING :: CHAINING

insert: 11, 27, 21, 18, 32, 44, 55



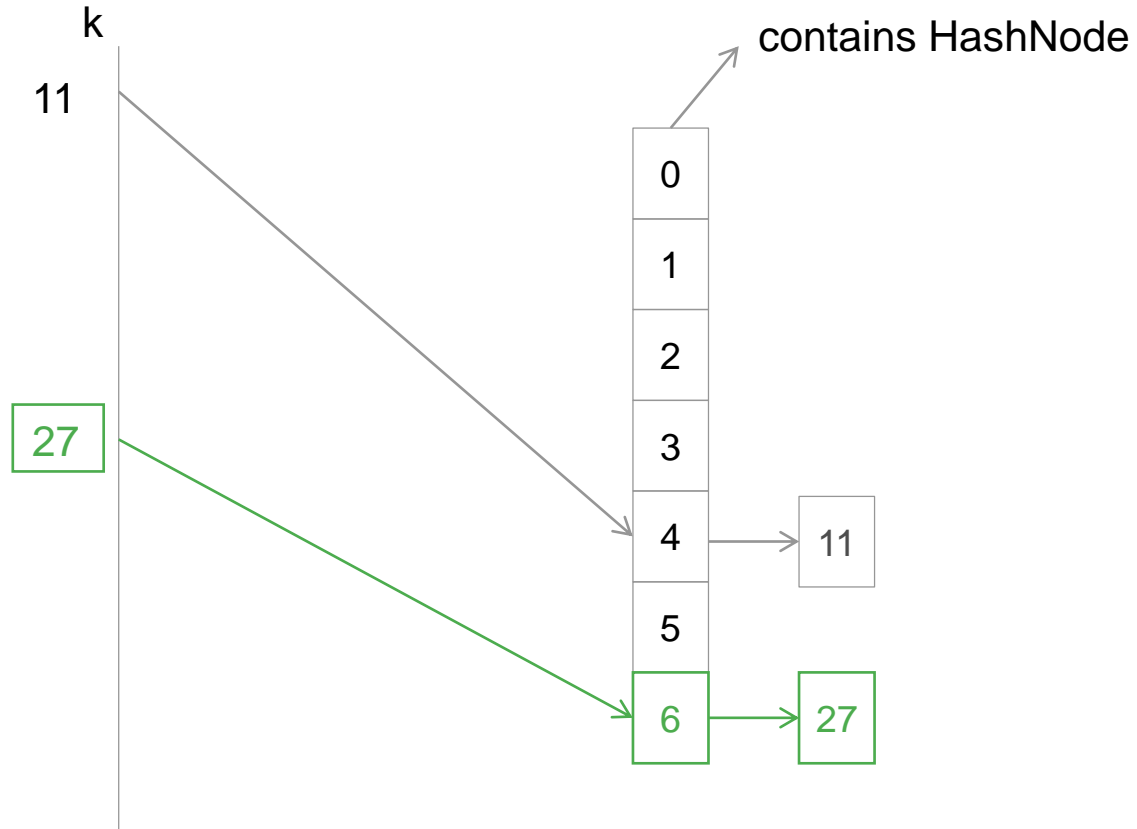
Hash values

$$h(11) = 11 \% 7 = 4$$

```
HashNode {  
    Integer key  
    HashNode next  
}
```


HASHING :: CHAINING

insert: 11, 27, 21, 18, 32, 44, 55



```

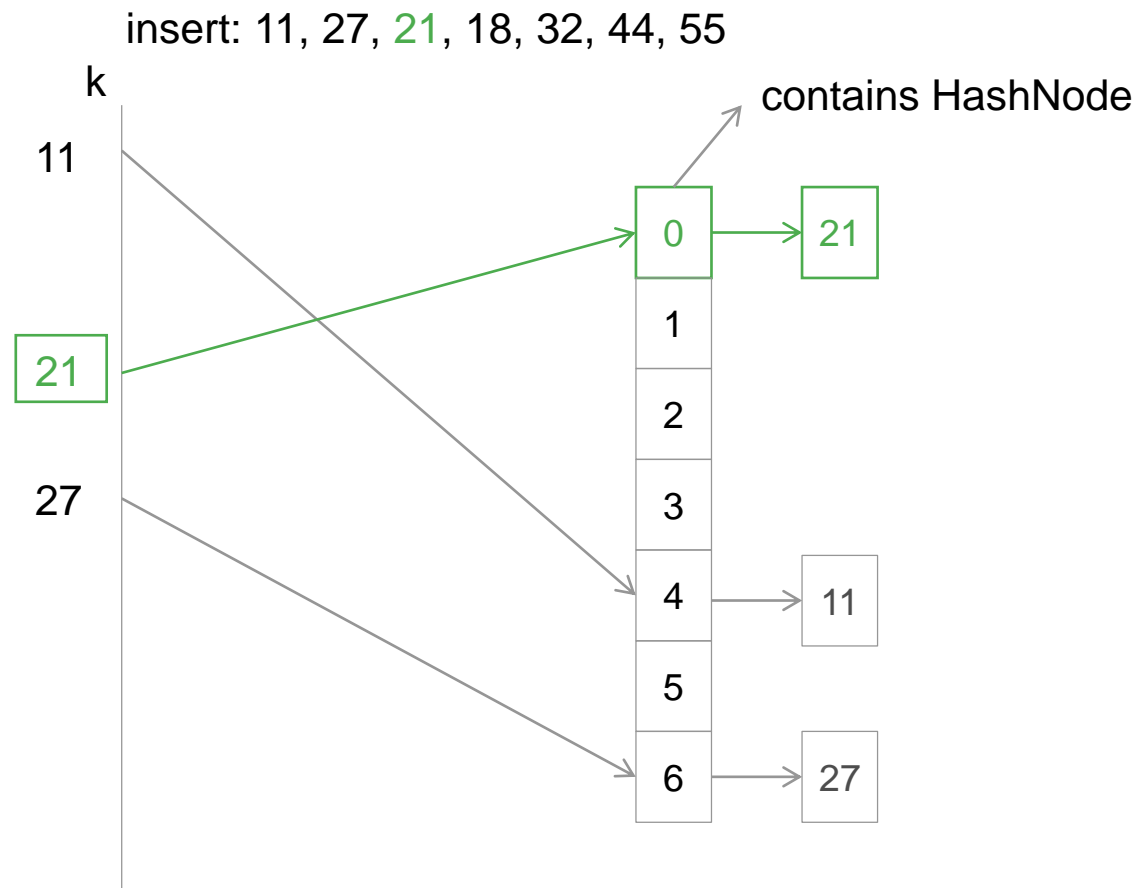
HashNode {
    Integer key
    HashNode next
}
    
```

Hash values

$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

HASHING :: CHAINING



```
HashNode {
    Integer key
    HashNode next
}
```

Hash values

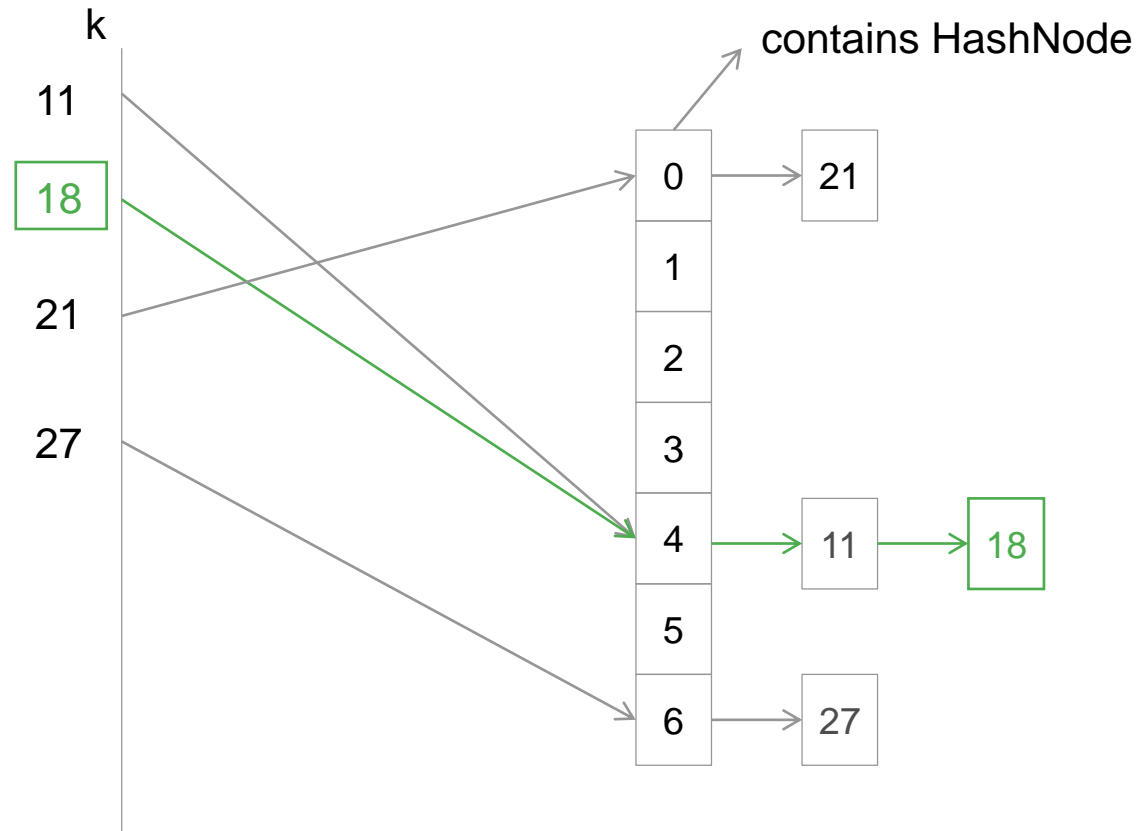
$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

$$h(21) = 21 \% 7 = 0$$

HASHING :: CHAINING

insert: 11, 27, 21, 18, 32, 44, 55



```

HashNode {
    Integer key
    HashNode next
}
    
```

Hash values

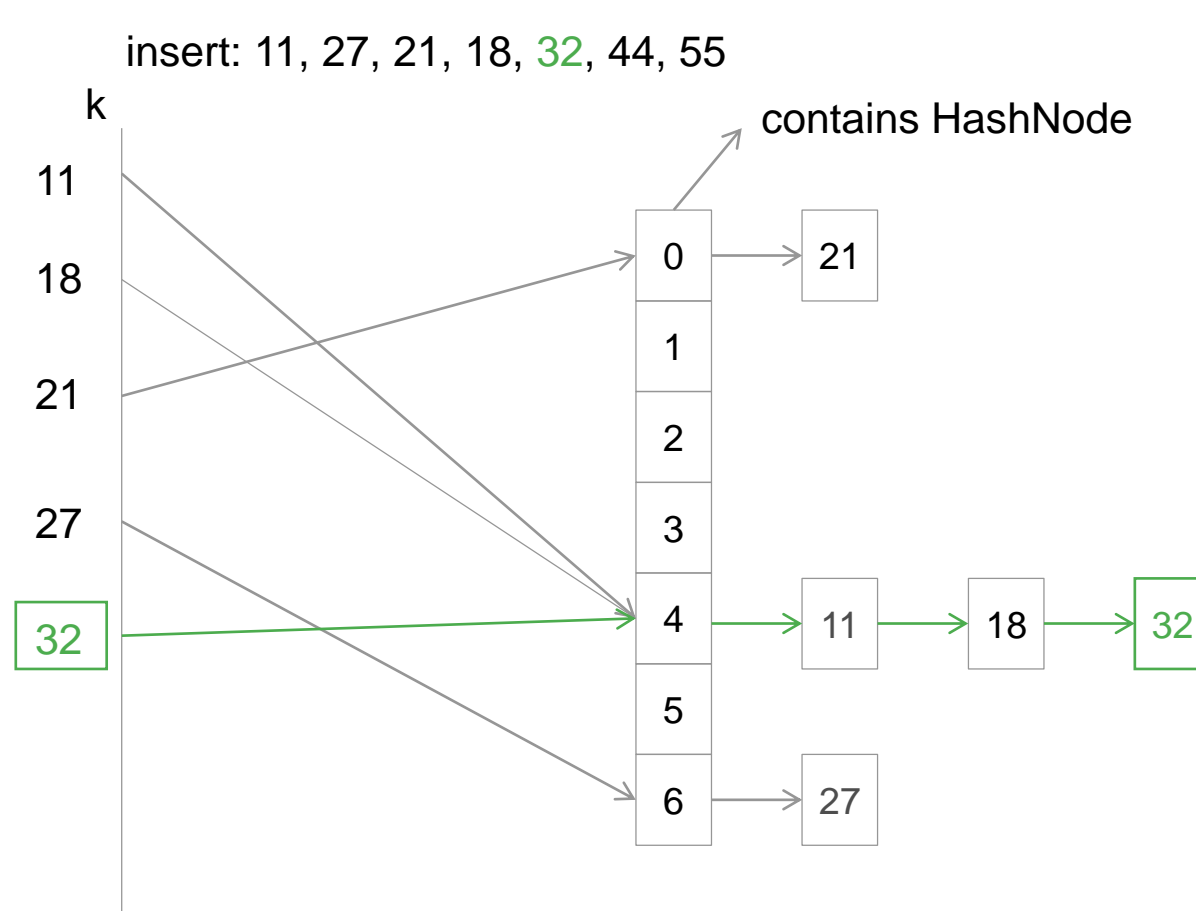
$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

$$h(21) = 21 \% 7 = 0$$

$$h(18) = 18 \% 7 = 4$$

HASHING :: CHAINING



Hash values

$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

$$h(21) = 21 \% 7 = 0$$

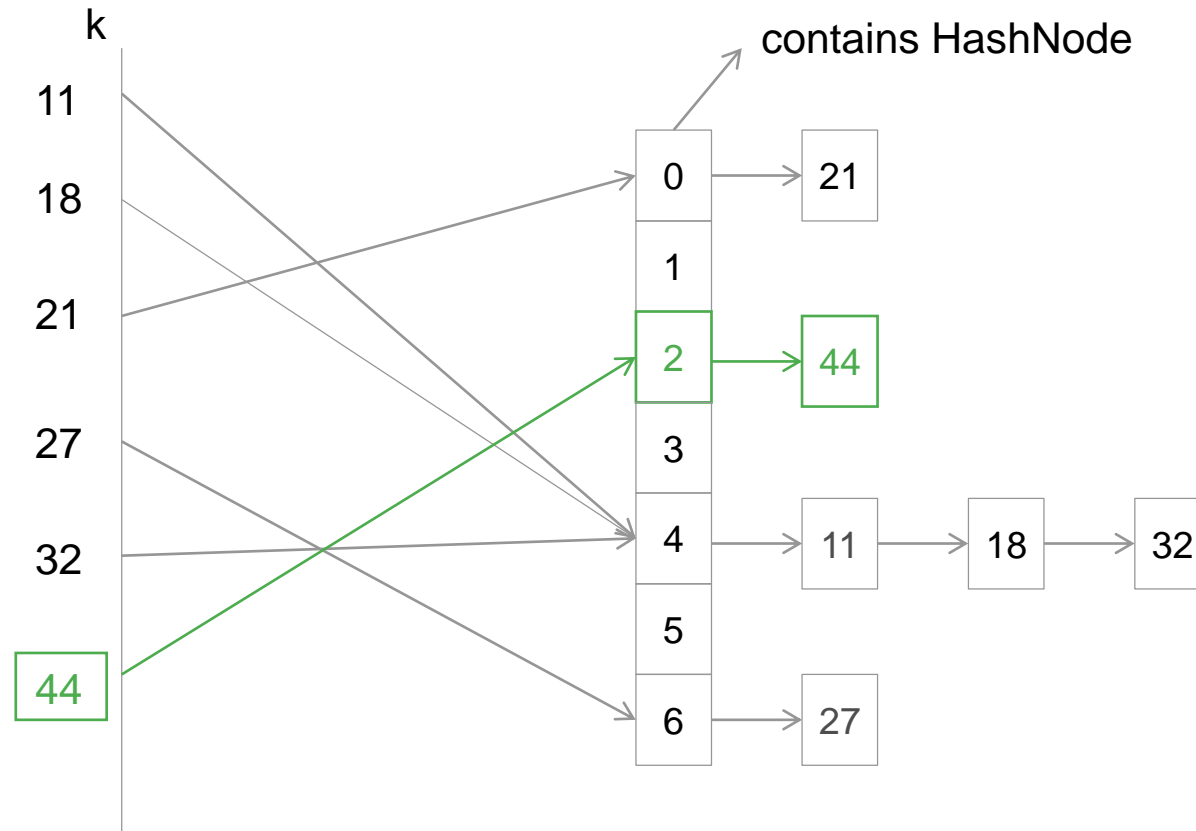
$$h(18) = 18 \% 7 = 4$$

$$h(32) = 32 \% 7 = 4$$

```
HashNode {  
    Integer key  
    HashNode next  
}
```

HASHING :: CHAINING

insert: 11, 27, 21, 18, 32, 44, 55



contains HashNode

Hash values

$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

$$h(21) = 21 \% 7 = 0$$

$$h(18) = 18 \% 7 = 4$$

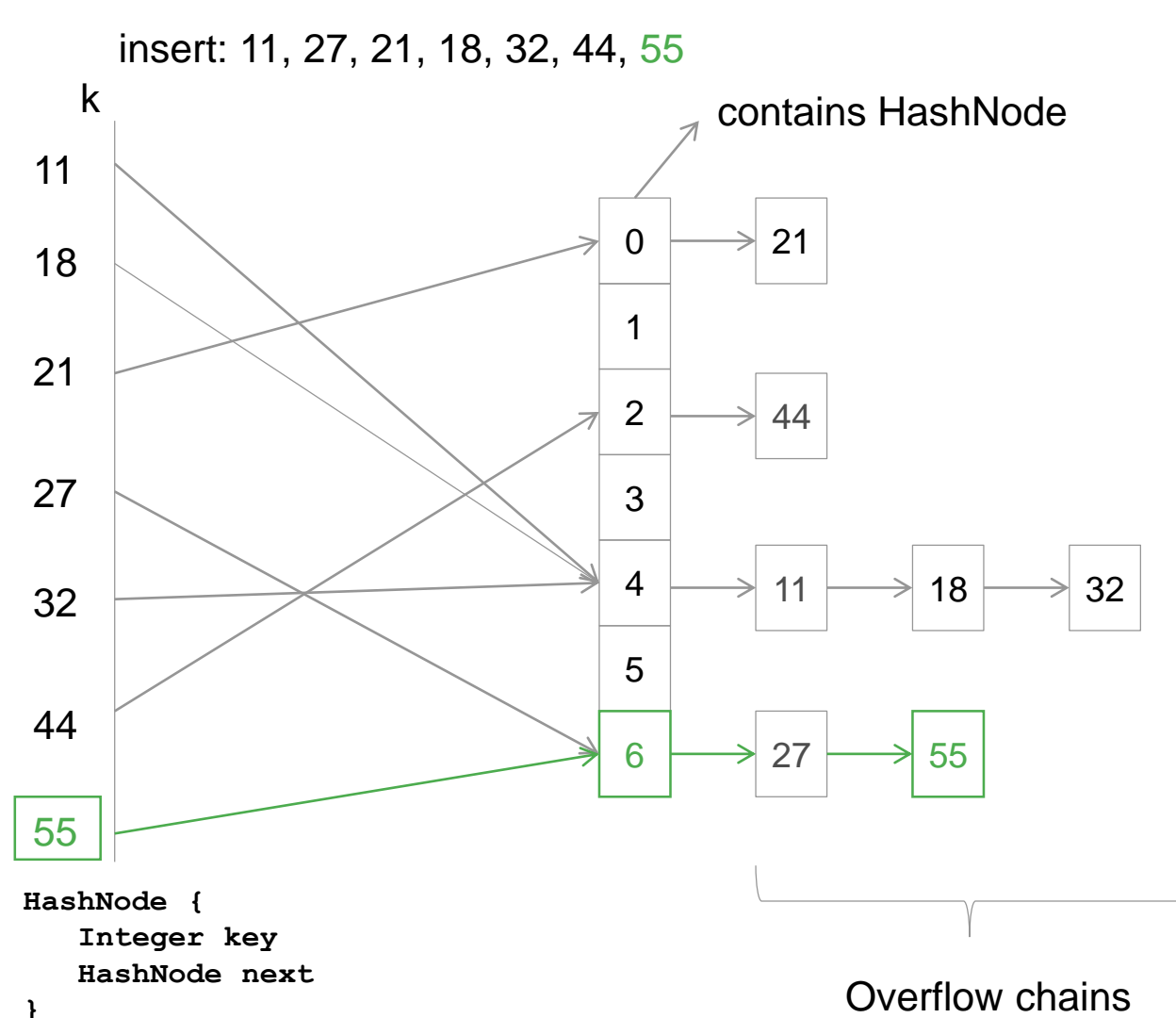
$$h(32) = 32 \% 7 = 4$$

$$h(44) = 44 \% 7 = 2$$

```

HashNode {
    Integer key
    HashNode next
}
    
```

HASHING :: CHAINING



Hash values

$$h(11) = 11 \% 7 = 4$$

$$h(27) = 27 \% 7 = 6$$

$$h(21) = 21 \% 7 = 0$$

$$h(18) = 18 \% 7 = 4$$

$$h(32) = 32 \% 7 = 4$$

$$h(44) = 44 \% 7 = 2$$

$$h(55) = 55 \% 7 = 6$$

HASHING :: RESOLVING COLLISIONS

2. Open addressing

Overflows are stored at vacant positions in the hash table:

- The sequence of the positions considered is referred to as the **probing sequence**.
- Follow this probing sequence until the first vacant position is found.

In the exercise we discuss:

- 2a) linear probing
- 2b) quadratic probing
- 2c) double hashing

HASHING :: LINEAR PROBING

Principle:

- If the calculated position is already occupied, move 1 element to the right (or left).
[→ **probing sequence**], until
 - a vacant position is found, or
 - the original element is found again (→ table is full)

Pseudo code:

```
insert(key)
  h = hash function(key)
  while(occupied(hashtable[h])) //collision
    h = hash function(h + 1)
    if(h == original index) return

  hashtable[h] = key // insert key at first vacant position
```


HASHING :: LINEAR PROBING

Example:

0	1	2	3	4	5	6
21				11		27

insert(18): $h(18) = 18\%7 = 4$ → collision '1'
→ $(4+1) \% 7 = 5$ → OK

0	1	2	3	4	5	6
21				11		27

0	1	2	3	4	5	6
21				11	18	27



HASHING :: LINEAR PROBING

Example:

insert(32): $h(32) = 32\%7 = 4$ \rightarrow collision '1'

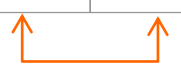
0	1	2	3	4	5	6
21				11	18	27

HASHING :: LINEAR PROBING

Example:

insert(32): $h(32) = 32\%7 = 4$ \rightarrow collision '1'
 $\rightarrow (4+1) \% 7 = 5$ \rightarrow collision '2'

0	1	2	3	4	5	6
21				11	18	27




HASHING :: LINEAR PROBING

Example:

insert(32): $h(32) = 32\%7 = 4$ \rightarrow collision '1'
 $\rightarrow (4+1) \% 7 = 5$ \rightarrow collision '2'
 $\rightarrow (4+2) \% 7 = 6$ \rightarrow collision '3'

0	1	2	3	4	5	6
21				11	18	27



HASHING :: LINEAR PROBING

Example:

insert(32): $h(32) = 32\%7 = 4$ \rightarrow collision '1'
 $\rightarrow (4+1) \% 7 = 5$ \rightarrow collision '2'
 $\rightarrow (4+2) \% 7 = 6$ \rightarrow collision '3'
 $\rightarrow (4+3) \% 7 = 0$ \rightarrow collision '4'

0	1	2	3	4	5	6
21				11	18	27


The diagram illustrates the linear probing process for inserting the value 32. The hash table has 7 slots. The initial state is: slot 0: 21, slot 1: empty, slot 2: empty, slot 3: empty, slot 4: 11, slot 5: 18, slot 6: 27. The probing sequence for inserting 32 is: slot 4 (collision), slot 5 (collision), slot 6 (collision), and slot 0 (collision). The arrows show the sequence of probes: from slot 4 to 5, 5 to 6, and 6 to 0.

HASHING :: LINEAR PROBING

Example:

insert(32): $h(32) = 32\%7 = 4$ \rightarrow collision '1'
 $\rightarrow (4+1) \% 7 = 5$ \rightarrow collision '2'
 $\rightarrow (4+2) \% 7 = 6$ \rightarrow collision '3'
 $\rightarrow (4+3) \% 7 = 0$ \rightarrow collision '4'
 $\rightarrow (4+4) \% 7 = 1$ \rightarrow OK

0	1	2	3	4	5	6
21	32			11	18	27



Primary clustering

HASHING :: LINEAR PROBING

Example: *remove(18)*

Begin with search (like for insert): $h(18)=4$

(1) If the element to be removed is at the first position \rightarrow *remove*

(2) If not \rightarrow search along the probing sequence until empty element is found or entire table has been traversed.

0	1	2	3	4	5	6
21	32			11	18	27

HASHING :: LINEAR PROBING

Example: *remove(18)*


Begin with search (like for insert): $h(18)=4$

(1) If the element to be removed is at the first position \rightarrow *remove*

(2) If not \rightarrow search along the probing sequence until empty element is found or entire table has been traversed.

0	1	2	3	4	5	6
21	32			11	18	27

0	1	2	3	4	5	6
21	32			11	18	27



HASHING :: LINEAR PROBING

Example: *remove(18)*


Begin with search (like for insert): $h(18)=4$

(1) If the element to be removed is at the first position \rightarrow *remove*

(2) If not \rightarrow search along the probing sequence until empty element is found or entire table has been traversed.

0	1	2	3	4	5	6
21	32			11	18	27

0	1	2	3	4	5	6
21	32			11	18	27




0	1	2	3	4	5	6
21	32			11		27

HASHING :: LINEAR PROBING

Example: *contains(32)*

- $h(32)=4$
- Element is not found at calculated position.
- Search along the probing sequence $(4+1)\%7=5$
- Position ,5' is empty. Search is terminated, although element 32 is stored in list!

0	1	2	3	4	5	6
21	32			11		27




HASHING :: LINEAR PROBING

Example: *contains(32)*

- $h(32)=4$
- Element is not found at calculated position.
- Search along the probing sequence $(4+1)\%7=5$
- Position ,5' is empty. Search is terminated, although element 32 is stored in list!

0	1	2	3	4	5	6
21	32			11		27




Problem: Keys with equal hash positions can be detached.

HASHING :: LINEAR PROBING

Example: *contains(32)*

- $h(32)=4$
- Element is not found at calculated position.
- Search along the probing sequence $(4+1)\%7=5$
- Position ,5' is empty. Search is terminated, although element 32 is stored in list!

0	1	2	3	4	5	6
21	32			11		27



Problem: Keys with equal hash positions can be detached.

Solution: Differ between EMPTY and REMOVED elements
→ Status flag for each entry

```
HashNode {  
    Integer key  
    boolean removed  
}
```

HASHING :: LINEAR PROBING

Initial situation

0	1	2	3	4	5	6
21	32			11	18	27
F	F			F	F	F

HASHING :: LINEAR PROBING

Initial situation

0	1	2	3	4	5	6
21	32			11	18	27
F	F			F	F	F

remove(18): $18\%7 \rightarrow (4+1)\%7=5$
→ found and mark position 5 as deleted

0	1	2	3	4	5	6
21	32			11		27
F	F			F	T	F

HASHING :: LINEAR PROBING

Initial situation

0	1	2	3	4	5	6
21	32			11	18	27
F	F			F	F	F


remove(18): $18\%7 \rightarrow (4+1)\%7=5$
→ found and mark position 5 as deleted.

0	1	2	3	4	5	6
21	32			11		27
F	F			F	T	F

contains(32): $32\%7 = 4$
Cancel search only if (1) EMPTY, (2) element is found, or (3) table is traversed entirely.

HASHING :: QUADRATIC PROBING

Principle:

- Instead of $(h + i) \% N$ we use $(h \pm i^2) \% N$
 - i.e.: for $h = 4$ we get
 - Quadratic: $4+1, 4-1, 4+4, 4-4, 4+9, 4-9, \dots$ ($= 5, 3, 8, 0, \dots$) instead of
 - Linear: $4+1, 4+2, 4+3, 4+4, 4+5, 4+6, \dots$ ($= 5, 6, 7, 8, \dots$)
- 

Example:

insert(32): $32 \% 7 = 4 \rightarrow$ collision

$\rightarrow (4 + 1^2) \% 7 = 5 \rightarrow$ collision

$\rightarrow (4 - 1^2) \% 7 = 3 \rightarrow$ 4 collisions before, now only 2 collisions

0	1	2	3	4	5	6
21			32	11	18	27

Alternative: Instead of this fixed sequence, you can use a second hash function!

HASHING :: DOUBLE HASHING

Principle:

- Reduce clustering by placing different elements with **different step sizes**.
- Definition of the probing sequence by
 - $h_1: k \rightarrow \{0, 1, \dots, N-1\}$
 - $h_2: k \rightarrow \{1, \dots, N-1\}$

Pseudo code:

```
insert(key)
    h = hash function 1(key)
    offset = hash function 2(key)
    while(occupied(hashtable[h])) // collision
        h = hash function 1(h + offset)
        if(h == original element) return
    hashtable[h] = key // insert key at first vacant position
```

Requirements:

- h_2 must not return 0 (would result in an endless loop on first collision).
- The value must be coprime to the table size, therefore table size should be a prime number.

HASHING :: DOUBLE HASHING

Requirement (*cont'd*):

- Table size should be a prime number or value must be coprime to the table size.

$N=8; \text{offset}=4; h=1$

$(1+4)\%8 = 5$

$(5+4)\%8 = 1$

$(1+4)\%8 = 5$

HASHING :: DOUBLE HASHING

Requirement (*cont'd*):

- Table size should be a prime number or value must be coprime to the table size.

$N=8; \text{offset}=4; h=1$

$$(1+4)\%8 = 5$$

$$(5+4)\%8 = 1$$

$$(1+4)\%8 = 5$$

$N=7; \text{offset}=4; h=1$

$$(1+4)\%7 = 5$$

$$(5+4)\%7 = 2$$

$$(2+4)\%7 = 6$$

$$(6+4)\%7 = 3$$

$$(3+4)\%7 = 0$$

$$(0+4)\%7 = 4$$

$$(4+4)\%7 = 1$$

$$(1+4)\%7 = 5$$

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12

insert(14):

$h1(14)=14\%13 = 1$ [$h2(14)=1+(14\%12)=3$]

0	1	2	3	4	5	6	7	8	9	10	11	12
	14											

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14											

insert(21):

$h1(21)=21\%13 = 8$ [$h2(21)=1+(21\%12)=10$]

0	1	2	3	4	5	6	7	8	9	10	11	12
	14							21				

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$


0	1	2	3	4	5	6	7	8	9	10	11	12
	14							21				

insert(1):

$h1(1)=1\%13 = 1$ AND $h2(1)=1+(1\%12)=2$

$\rightarrow (1+2)\%13 = 3$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1					21				



HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1					21				

insert(19):

$h1(19)=19\%13 = 6$ [$h2(19)=1+(19\%12)=8$]

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21				

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21				

insert(10):

$h1(10)=10\%13 = 10$ [$h2(10)=1+(10\%12)=11$]

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21		10		

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21		10		

insert(11):

$h1(11)=11\%13 = 11$ [$h2(11)=1+(11\%12)=12$]

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21		10	11	

HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
	14		1			19		21		10	11	

insert(6):

$h1(6) = 6 \% 13 = 6$ AND $h2(6) = 1 + 6 \% 12 = 7$

$\rightarrow (6+7) \% 13 = 0$

0	1	2	3	4	5	6	7	8	9	10	11	12
6	14		1			19		21		10	11	



HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
6	14		1			19		21		10	11	

insert(42):

$h1(42) = 42 \% 13 = 3$ AND $h2(42) = 1 + 42 \% 12 = 7$

$(3+7) \% 13 = 10$

$(10+7) \% 13 = 4$

0	1	2	3	4	5	6	7	8	9	10	11	12
6	14		1	42		19		21		10	11	



HASHING :: DOUBLE HASHING

Example:

$N=13$

$h1(k) = k \% N$

$h2(k) = 1 + k \% (N-1) \rightarrow \text{offset}$

probing sequence: $h_{\text{new}} = h1(h_{\text{old}} + \text{offset})$

0	1	2	3	4	5	6	7	8	9	10	11	12
6	14		1	42		19		21		10	11	

insert(8):

$h1(8)=8\%13 = 8$ AND $h2(8)=1+8\%12=9$

$(8+9)\%13 = 4$

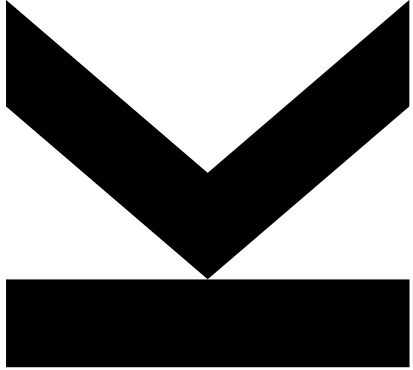
$(4+9)\%13 = 0$

$(0+9)\%13 = 9$

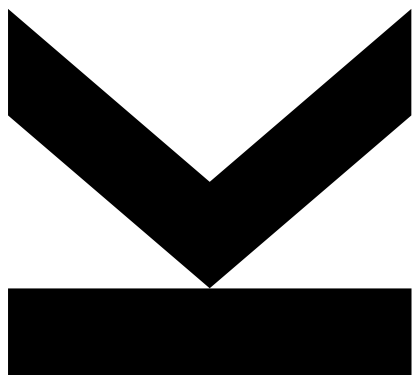
0	1	2	3	4	5	6	7	8	9	10	11	12
6	14		1	42		19		21	8	10	11	



ASSIGNMENT 03



HASHING



Algorithms and Data Structures 2
Exercise – 2021W

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