

1	Floyd's Algorithm for APSP (*S*D search in weighted graphs) Q10.1, Q10.2
2	Transitive Closure of di-graphs, Warshall's algorithm, Q10.3
3	Hashing
LAB	Assignment 2: Q&A and/or implementing W10.3, W10.4

Floyd Algorithm – APSP ($APSP == S * D$)

Floyd Algorithm aka. Floyd-Warshall Algorithm

The Task:

- Given a weighted graph $G=(V,E,w(E))$
- Find shortest path (path with min weight) *between all pairs of vertices. ($S * D$)*

?:

- can we use Dijkstra's Algorithm for the task?
- why Floyd-Warshall's ?

parameters & sub-problems:

- Problem: shortest path between all pairs (i,j)
- Value to optimize: a matrix D of V rows, V cols
- $DP[k] = D^k$: matrix of shortest path values after using k nodes 1..k as the transit points

Recurrence:

$D_0 = ?$

$D_k = ?$

Floyd Algorithm: DP for APSP

parameters & sub-problems:

- Problem: shortest path between all pairs (i,j)
- Value to optimize: a matrix D of V rows, V cols
- DP[k]= D^k : matrix of shortest path values, using k nodes 1..k as the transit points

Recurrence:

$$D_{ij}^0 := W_{ij}, \quad D_{ij}^k := \min \left\{ D_{ij}^{k-1}, D_{ik}^{k-1} + D_{kj}^{k-1} \right\}$$

Note: D^k only depends on D^{k-1} → just transform D, no need to have array of D

```
D := W    // W is the weight matrix of the graph
```

```
for each node k in 1..V:
```

```
    // use k as a stepstones
```

```
    for each pair (i,j): // for (i=...) for (j=...
```

```
        if  $D_{ik} + D_{kj} < D_{ij}$ 
```

```
             $D_{ij} := D_{ik} + D_{kj}$ 
```

Floyd Algorithm

$$D_{ij}^0 := W_{ij}, \quad D_{ij}^k := \min \left\{ D_{ij}^{k-1}, D_{ik}^{k-1} + D_{kj}^{k-1} \right\}$$

Conditions:

- directed or undirected ?
- weighted or unweighted?
- can be applied to negative weights?

Data structures / Graph representation = `adjacency matrix`

Complexity = `O(?)` or `Θ(?)`

Comparing with repeating Dijkstra (DA) for the same task:

- `Applicability`
- `Complexity`

Floyd Algorithm

$$D_{ij}^0 := W_{ij}, \quad D_{ij}^k := \min \left\{ D_{ij}^{k-1}, D_{ik}^{k-1} + D_{kj}^{k-1} \right\}$$

Conditions:

- directed or undirected ? both
- weighted or unweighted: weighted, for unweighted: set edge weight to 1
- negative weights possible, but NOT negative cycles

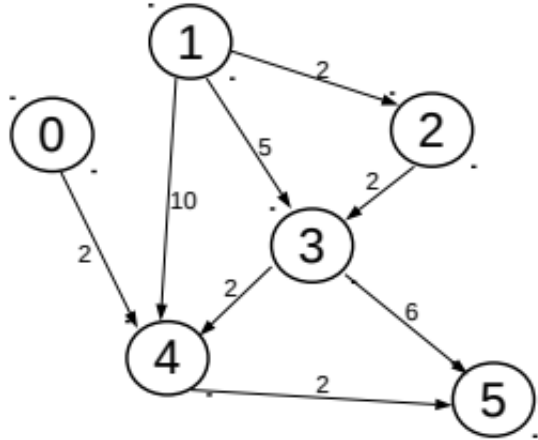
Data structures / Graph representation = `adjacency matrix`

Complexity = $\Theta (V^3)$

Comparing with repeating Dijkstra:

- Both are used for shortest paths only [NOT for longest path]
- Floyd allows negative weights, Dijkstra not
- Complexity of repeating DA is $O(V(V+E)\log V)$

Step-by-step Example: Tracing Floyd for a graph



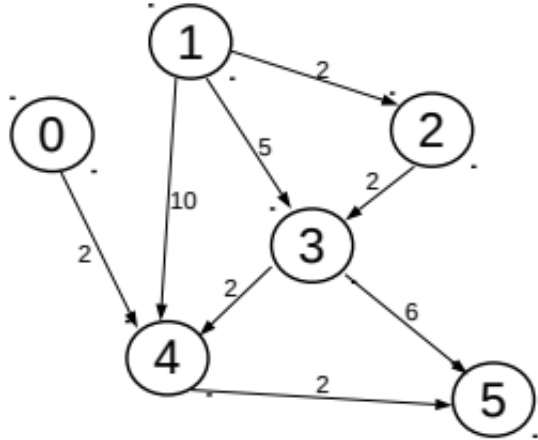
empty cell for ∞
(note $A[s][s]$
should be zero)

Trace the Floyd algorithm.

Step $i = 0, 1, 2, 3, 4, 5$

		-----TO (t) -----					
		0	1	2	3	4	5
-----FROM (s) -----	0	0				2	
	1		0	2	5	10	
	2			0	2		
	3				0	2	6
	4					0	2
	5						0

Tracing Floyd Algorithm



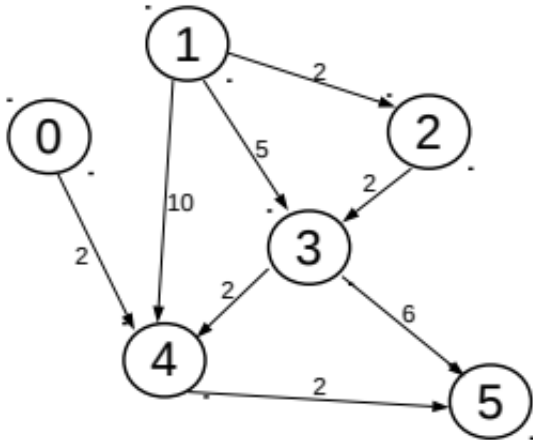
Notes:

- when 0, 1, or 5 is used as an intermediate, no change is possible (why?)

	0	1	2	3	4	5
0	0				2	
1		0	2	5	10	
2			0	2		
3				0	2	6
4					0	2
5						0

Tracing Floyd Algorithm

k= **2** as the stepstone: select rows **2** and column **2** as references



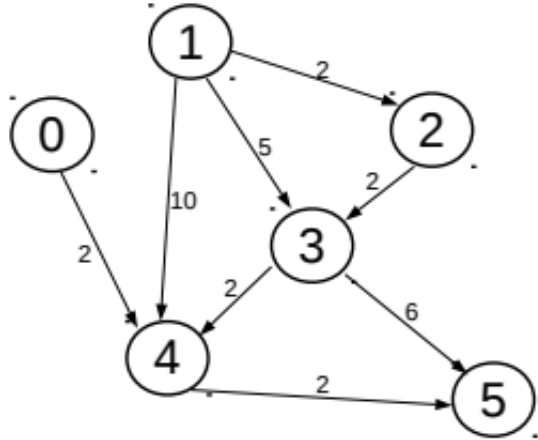
row **2** gives
paths
“from **2** to t”

column **2** gives
paths
“from s to **2**”

Only this cell need
to be considered.
Why?

	0	1	2	3	4	5
0	0				2	
1		0	2		10	
2			0	2		
3				0	2	6
4					0	2
5						0

Tracing Floyd Algorithm



k= **2** as the stepstone

	0	1	2	3	4	5
0	0				2	
1		0	2	4	10	
2			0	2		
3				0	2	6
4					0	2
5						0

Tracing Floyd Algorithm

No change at $k=0$ and $k=1$

$k=2$ as the stepstone

	0	1	2	3	4	5
0	0				2	
1		0	2	4	10	
2			0	2		
3				0	2	6
4					0	2
5						0

$k=3$ as the stepstone

	0	1	2	3	4	5
0	0				2	
1		0	2	4	6	10
2			0	2	4	8
3				0	2	6
4					0	2
5						0

$k=4$ as the stepstone,
done (no change at
 $k=5$)

	0	1	2	3	4	5
0	0				2	4
1		0	2	4	6	8
2			0	2	4	6
3				0	2	4
4					0	2
5						0

Q10.3: manual exec of Floyd's

Perform Floyd's algorithm on the graph given by the following weights matrix:

$$W = \begin{bmatrix} 0 & 3 & \infty & 4 \\ \infty & 0 & 5 & \infty \\ 2 & \infty & 0 & \infty \\ \infty & \infty & 1 & 0 \end{bmatrix}.$$

$$D_{ij}^0 := W_{ij}, \quad D_{ij}^k := \min \left\{ D_{ij}^{k-1}, D_{ik}^{k-1} + D_{kj}^{k-1} \right\}$$

Q 10.3: Check your answer

$$D_{ij}^0 := W_{ij}, \quad D_{ij}^k := \min \left\{ D_{ij}^{k-1}, D_{ik}^{k-1} + D_{kj}^{k-1} \right\}$$

$$D^0 = \begin{bmatrix} 0 & 3 & \infty & 4 \\ \infty & 0 & 5 & \infty \\ 2 & \infty & 0 & \infty \\ \infty & \infty & 1 & 0 \end{bmatrix}$$

$$D^1 = \begin{bmatrix} \mathbf{0} & \mathbf{3} & \infty & \mathbf{4} \\ \infty & 0 & 5 & \infty \\ \mathbf{2} & \mathbf{5} & 0 & \mathbf{6} \\ \infty & \infty & 1 & 0 \end{bmatrix}$$

$$D^2 = \begin{bmatrix} 0 & \mathbf{3} & \mathbf{8} & 4 \\ \infty & \mathbf{0} & \mathbf{5} & \infty \\ 2 & \mathbf{5} & 0 & 6 \\ \infty & \infty & 1 & 0 \end{bmatrix}$$

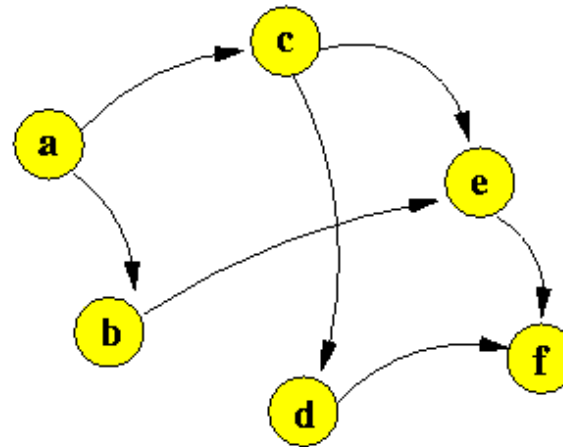
$$D^3 = \begin{bmatrix} 0 & 3 & \mathbf{8} & 4 \\ \mathbf{7} & 0 & \mathbf{5} & \mathbf{11} \\ \mathbf{2} & \mathbf{5} & 0 & \mathbf{6} \\ \mathbf{3} & \mathbf{6} & \mathbf{1} & 0 \end{bmatrix}$$

$$D := D^4 = \begin{bmatrix} 0 & 3 & \mathbf{5} & \mathbf{4} \\ 7 & 0 & 5 & \mathbf{11} \\ 2 & 5 & 0 & \mathbf{6} \\ \mathbf{3} & \mathbf{6} & \mathbf{1} & 0 \end{bmatrix}$$

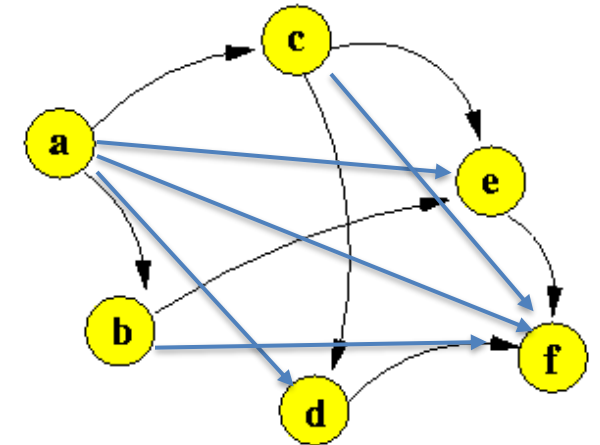
Transitive Closure of digraphs

Understanding:

- Transitive Closure of a di-graph
- Why not for undirected graph?



Directed graph **G**

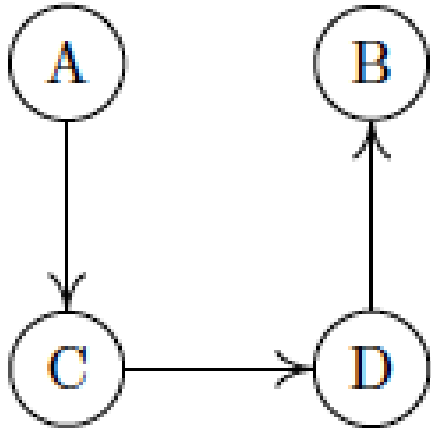


$G' = \text{Transitive Closure of } G$
Edge $u \rightarrow v$ in G' means v
is reachable from u in G

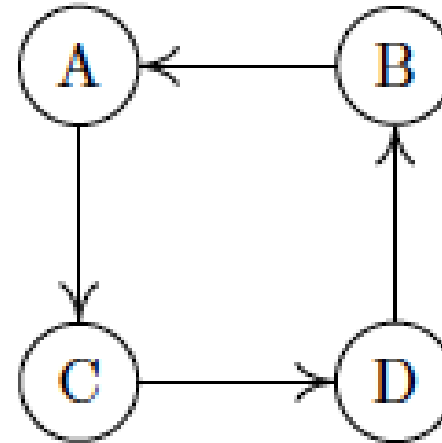
Q10.1: Transitive Closure of digraphs

Draw the transitive closure of the following two graphs:

(a)



(b)



Warshall's Algorithm: a DP algo for Transitive Closure

Input:

- adjacent matrix $A[1..n][1..n]$ of an input graph G

Output:

- adjacent matrix of the transitive closure of G

Main argument:

- transitivity: if there are paths $i \rightarrow k$ and $k \rightarrow j$, then there is path $i \rightarrow j$ which uses k as an intermediate node ($i, j, k \in 1..n$)

Warshall's Algorithm: Solve the problem using DP, similar to APSP. First decide:

- parameters & sub-problems:
 R^k = matrix of connectivity after using nodes $1..k$ as intermediates
- recurrence:

$$R_{ij}^0 := A_{ij}, \quad R_{ij}^k := R_{ij}^{k-1} \text{ or } \left(R_{ik}^{k-1} \text{ and } R_{kj}^{k-1} \right)$$

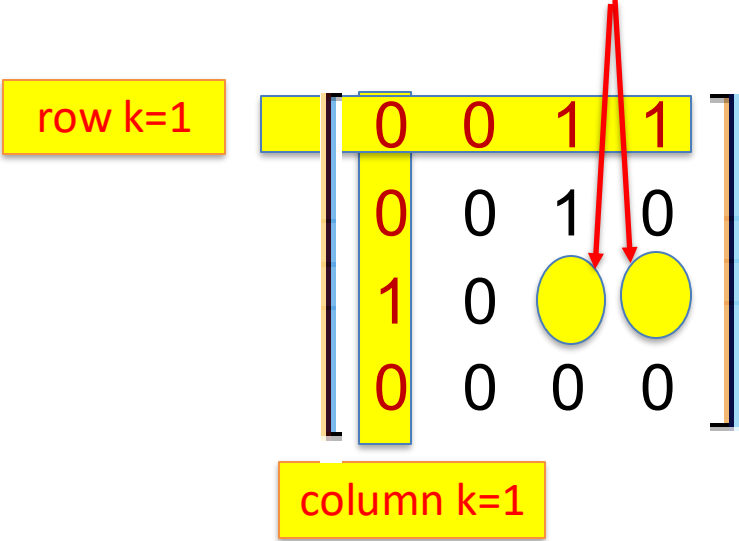
Q 10.2: Manually Tracing the Warshall's Algorithm

$R_{ij}^0 := A_{ij}, \quad R_{ij}^k := R_{ij}^{k-1} \text{ or } (R_{ik}^{k-1} \text{ and } R_{kj}^{k-1})$

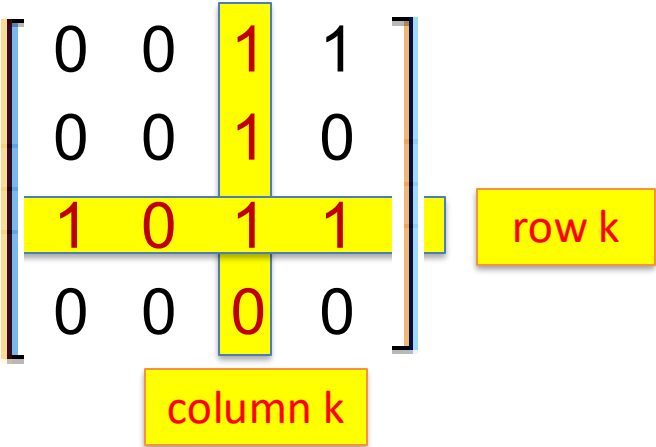
only cell with both non-zero references can change

$R^0 = A = \begin{bmatrix} 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix}$

Set R= A, R is R⁰
transition from 0 to 1 by:
- looking at for all possible ij
- it can be done by using column 1 and row 1 as references



similarly for any transition from R^{k-1} to R^k: use row k and column k as references.



hashing: introductory exercise

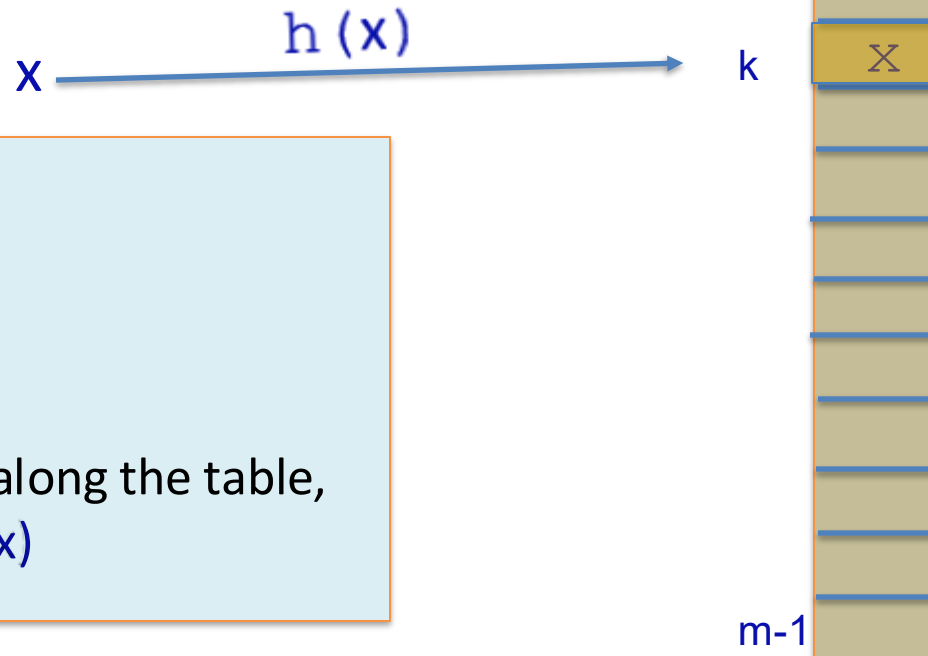
Using array $A[0..99]$, how to keep $n < 100$ distinct integer keys for efficient search and insert, if :

- a) the keys are in the range $0..99$
- b) the keys are in the range $200..299$
- c) the keys are in the range $0..299$

Hash Table: dictionary with average $O(1)$ search/insert

Hashing = hash table T + hash function $h(x)$: store key x at $T[h(x)]$

suppose $h(x) = k$
for some x



- $T[0..m-1]$: a hash table of size m
- $T[i]$: a hash slot, or hash bucket
- $h(x)$: hash function, that
 - $0 \leq h(x) < m$
 - distributes keys evenly (uniformly) along the table,
 - is efficient: ($\theta(1)$) for computing $h(x)$

Collisions

Collision when $h(x_1) = h(x_2)$ for some $x_1 \neq x_2$.

Examples:

$$h(x) = x \bmod 100$$

insert $x_1 = 1$, $x_2 = 101 \rightarrow$ collision

Collisions are normally unavoidable.

Collisions

Example:

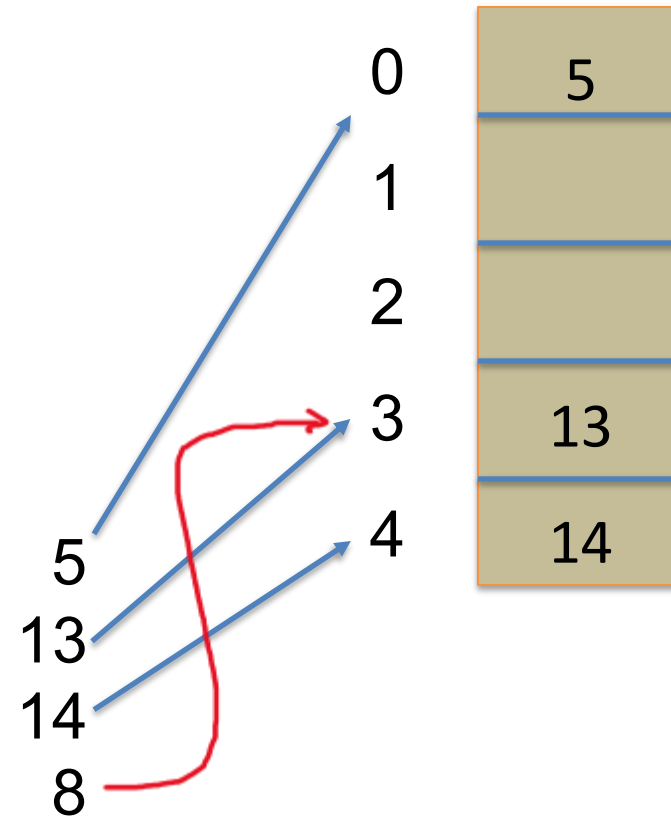
$m=5$, $h(x) = x \% m$

Here: $h(8) == h(5)$

Methods *to reduce collisions*:

- using *a prime number* for hash table size m .
- making the table size m *big*

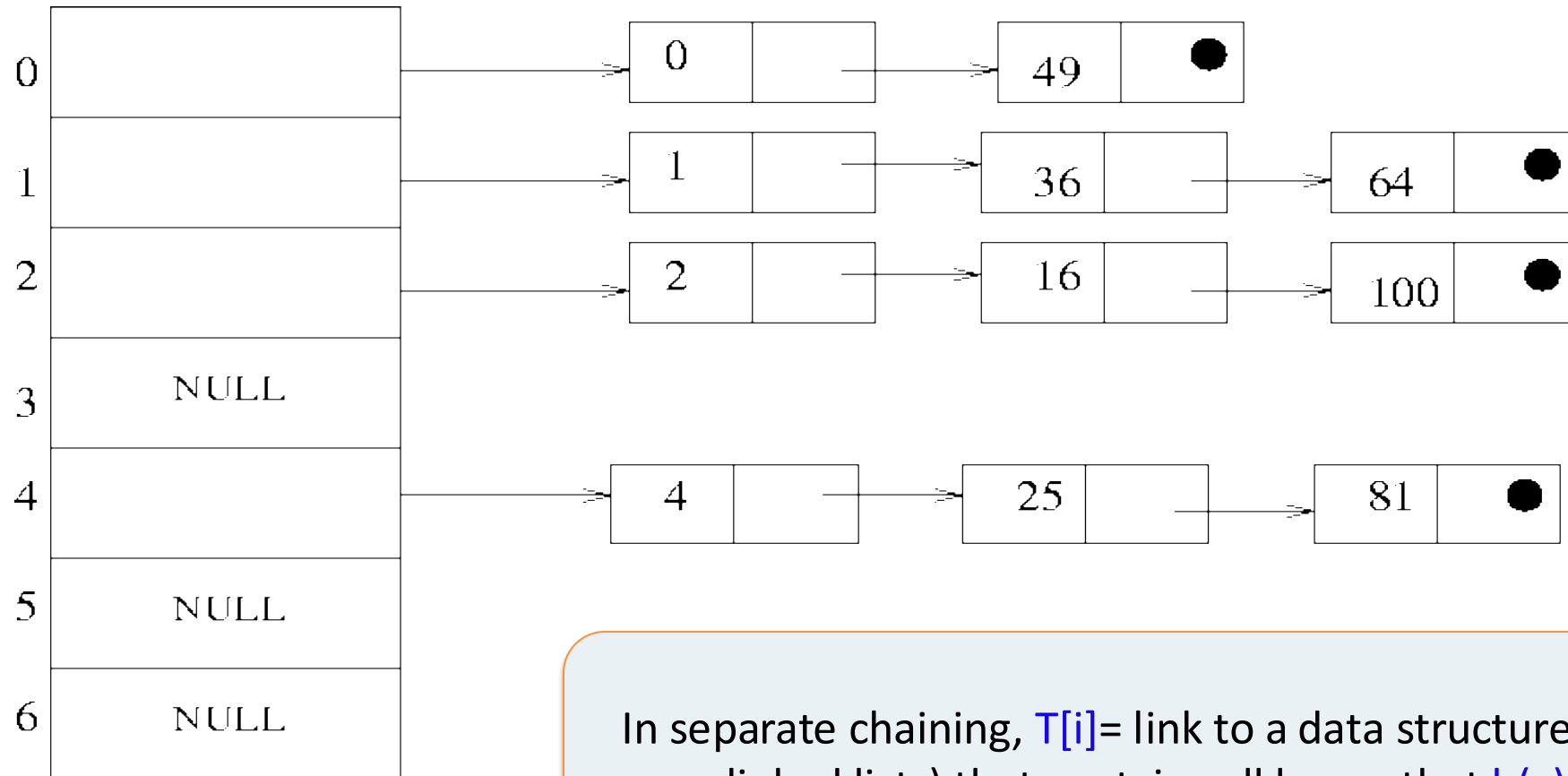
Even though, collisions might still happen



Collision Solution 1: Separate Chaining

$h(x) = x \% 7$, keys entered:

0, 1, 49, 2, 36, 4, 64, 16, 25, 100, 81



In separate chaining, $T[i]$ = link to a data structure (such as linked lists) that contains all keys x that $h(x) == i$

Solution 2: Linear Probing (here, data are kept in the hash table)

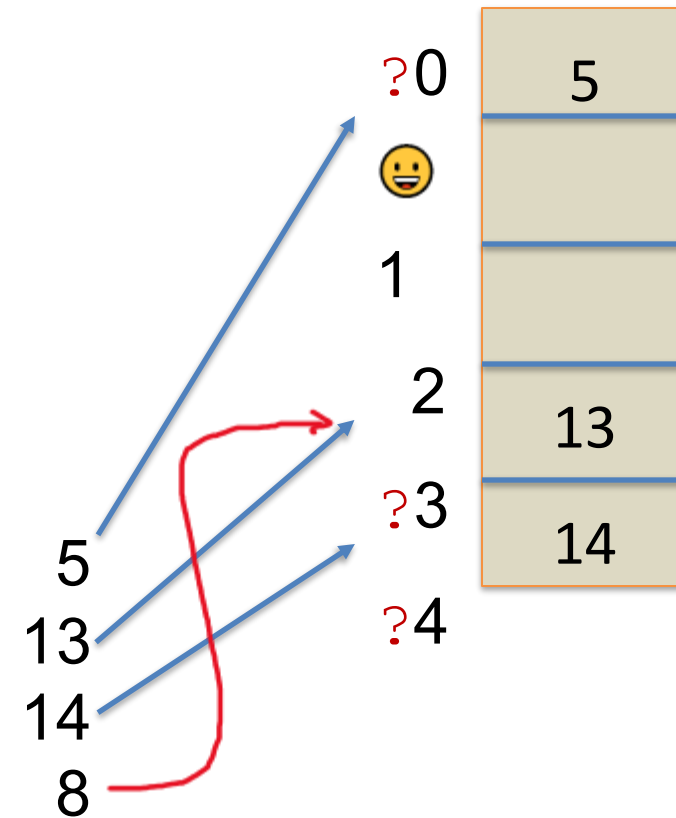
linear probing= *when colliding, use the successive empty bucket.*

Example: $m=5$, $h(x)=x \bmod m$,

keys inserted: 5, 13, 4, 8

Hashing with linear probing:

- When inserting we do some probes until getting a vacant slot:
 $h(x)$ replaced by
 $H(x, \text{probe}) = (h(x) + \text{probe}) \bmod m$
where probe is 0, 1, 2 ...
ie. *examining forward with step= 1 until reaching a vacant slot*
- The same procedure for search
- Deletion is problematic! (why?)



Double Hashing

When colliding, look forward for empty cells at distance $h_2(x)$, ie. examining forward with constant step= $h_2(x)$

Example: $m=5$, $h(x)=x \bmod m$,

$h_2(x)=x \bmod 3 + 1$,

keys inserted: 5, 13, 4, 8

Hashing with double hashing:

similar to *linear probing*, but employ a second hash function $h_2(x)$:

$$H(x, \text{probe}) = (h(x) + \text{probe} * h_2(x)) \bmod m$$

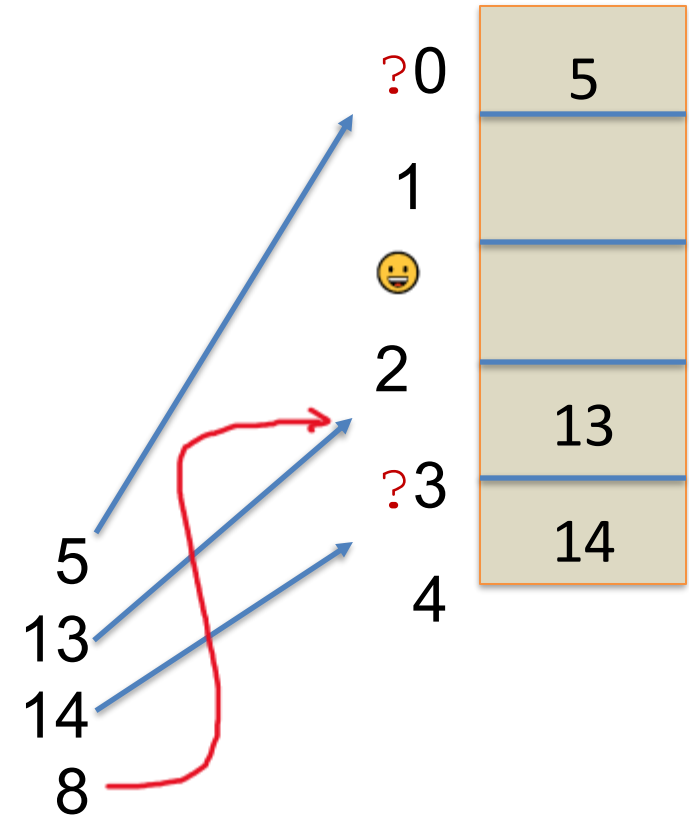
where probe is 0, 1, 2, ... (until reaching a vacant slot).

Note that:

- $h_2(x) \neq 0$ for all x , (why?)
- to be good, $h_2(x)$ should be co-prime with m , (how?)

Note: *linear probing* is just a special case of *double hashing* when $h_2(x)=1$.

Both linear probing and double hashing are referred to as *Open Addressing methods*.



Q 10.4, 10.5, 10.6 [Group/Individual]

Q 10.4: [Separate chaining] Consider a hash table in which the elements inserted into each slot are stored in a linked list. The table has a fixed number of slots $L=2$. The hash function to be used is $h(k) = k \bmod L$.

- a) Show the hash table after insertion of records with the keys
17 6 11 21 12 33 5 23 1 8 9
- b) Can you think of a better data structure to use for storing the records in each slot?

Q 10.5 [Open Addressing]: Consider a hash table in which each slot can hold one record and additional records are stored elsewhere in the table using linear probing with steps of size $i=1$. The table has a fixed number of slots $L=8$. The hash function to be used is $h(k) = k \bmod L$.

- a) Show the hash table after insertion of records with the keys
17 7 11 33 12 18 9
- b) Repeat using linear probing with steps of size $i = 2$. What problem arises, and what constraints can we place on i and L to prevent it?
- c) Can you think of a better way to find somewhere else in the table to store colliding keys?

Q 10.6 [double hashing]: Consider a hash table in which each slot can hold one record and additional records are stored elsewhere in the table using double hashing. The table has a fixed number of slots $L = 13$.

The hash function to be used is $h(k) = k \bmod 13$. The second hash function to be used is $h_2(k) = k \bmod 5 + 1$.

Show the hash table after insertion of records with the keys 14 30 17 33 55 31 29 16

Assignment 2: Q&A

Floyd-Warshall Algorithm: How to retrieve the path between $i \rightarrow j$?

In DP, in addition to matrix $\text{dist}[i][j]$ = shortest path length from i to j , also maintain

matrix $\text{stone}[i][j]$ = the decision made for the pair (i, j)
= the first stop on the path $i \rightarrow j$

Algorithm:

for each node k in V :

for each pair (i, j) : // for $(i=...)$ for $(j=...$

if $(\text{dist}[i][k] + \text{dist}[k][j] < \text{dist}[i][j])$ { // if new path is shorter

$\text{dist}[i][j] = \text{dist}[i][k] + \text{dist}[k][j]$ // ... take it, update dist

$\text{stone}[i][j] = k$ // ... and update stone

}

Q10.2: Check your answer

$R_{ij}^0 := A_{ij}, \quad R_{ij}^k := R_{ij}^{k-1} \text{ or } \left(R_{ik}^{k-1} \text{ and } R_{kj}^{k-1} \right)$
 \Leftrightarrow if $R_{ij}=0$, change it to 1 iif R_{ik} and R_{kj} are both 1

$$R^0 = \begin{bmatrix} 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

$$R^1 = \begin{bmatrix} 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 1 & 1 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

$$R^2 = \begin{bmatrix} 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

no change
col 2 is 0

$$R^3 = \begin{bmatrix} 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

$$B := R^4 = \begin{bmatrix} 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

no change
row 4 is 0

Check: Q 10.4: Separate chaining

Consider a hash table in which the elements inserted into each slot are stored in a linked list. The table has a fixed number of slots $L=2$. The hash function to be used is $h(k) = k \bmod L$.

- a) Show the hash table after insertion of records with the keys
17 6 11 21 12 33 5 23 1 8 9
- b) Can you think of a better data structure to use for storing the records in each slot?

Your solution & notes:

- a)
- | | | |
|---|--|------------------------------------|
| 0 | | 6 → 12 → 8 |
| 1 | | 17 → 11 → 21 → 33 → 5 → 23 → 1 → 9 |

- b) array/sorted array? balanced search trees such as AVL or 2-3 tree?

but why the above hashing is so bad? perhaps we should solve a more general problem: how to make that hashing better, including increasing table size (with a prime number), changing hash function.

Check: Q 10.5: Open addressing

Consider a hash table in which each slot can hold one record and additional records are stored elsewhere in the table using linear probing with steps of size $i=1$. The table has a fixed number of slots $L=8$. The hash function to be used is $h(k)=k \bmod L$.

- a) Show the hash table after insertion of records with the keys
17 7 11 33 12 18 9
- b) Repeat using linear probing with steps of size $i = 2$. What problem arises, and what constraints can we place on i and L to prevent it?
- c) Can you think of a better way to find somewhere else in the table to store colliding keys?

Your solution & notes:

a)

0	1	2	3	4	5	6	7
17	33	11	12	18	9	7	

b)

0	1	2	3	4	5	6	7
17	18	11	12	33		7	
9?		9?		9?	9?		

this is double hashing with $h2(x)=2$, trouble because m and 2 are not co-prime, choose $h2(x)=$ odd number such as 3 would help!

c) double hashing with $h2(x) \neq 0$ and $h2(x)$ co-prime with m , such as: m prime and $h2(x) < m$, or $m=2^k$, $h2(x)$ odd