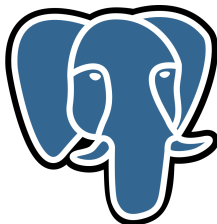


Distance-Vector Routing With SQL

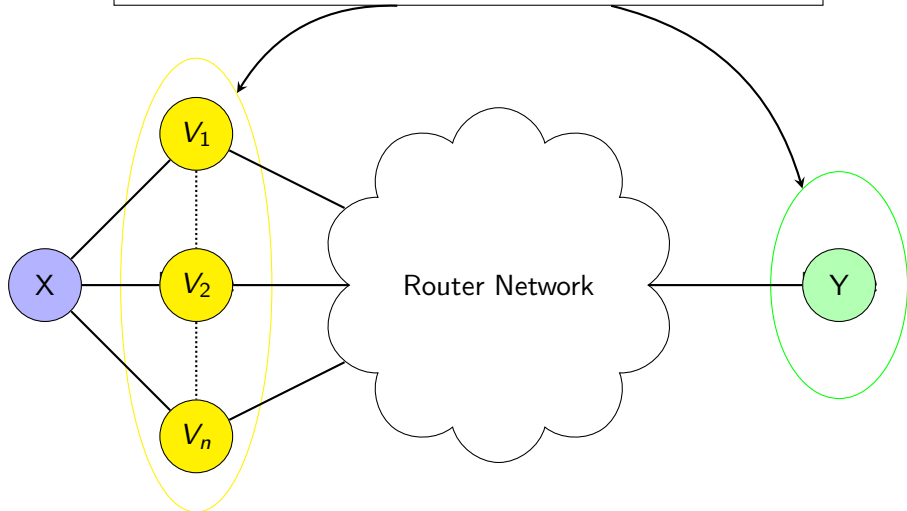
Alexej Onken

27.01.2023



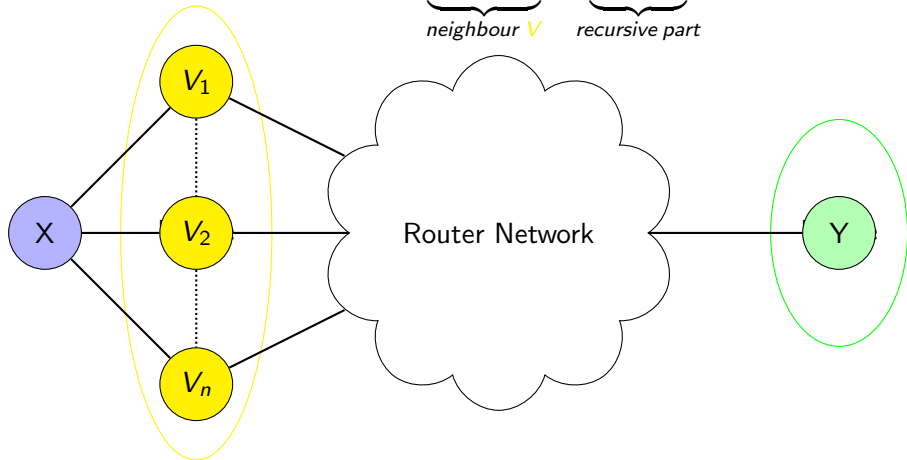
Motivating Example

What is the fastest path from X to Y via neighbour V_i ?



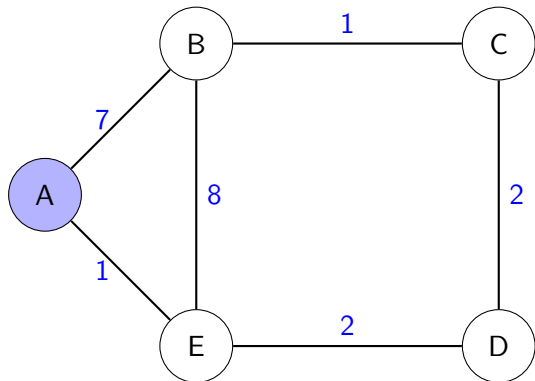
Motivating Example

$$d_X(Y) = \min_V \underbrace{\{c(X, V)\}}_{\text{neighbour } V} + \underbrace{d_V(Y)}_{\text{recursive part}}$$



What Are We Dealing With?

Given a **router network** consisting of **routing tables** of each node

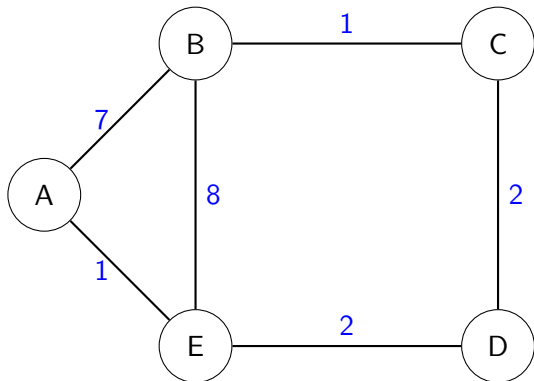


Node A's routing table

	TO			
VIA	B	C	D	E
B	7	-	-	-
C	-	-	-	-
D	-	-	-	-
E	-	-	-	1

What Are We Dealing With?

Distance-Vector Routing is a dynamic protocol from [network technology](#)

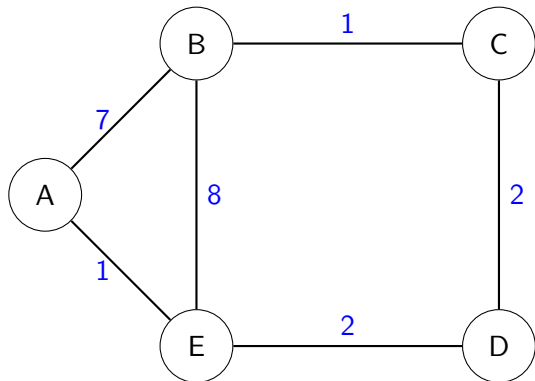


Initial configuration					
	TO				
FROM	A	B	C	D	E
A	0	7	-	-	1
B	7	0	1	-	8
C	-	1	0	2	-
D	-	-	2	0	2
E	1	8	-	2	0

What Are We Dealing With?

Bellman-Ford in an **undirected graph** without **negative edge weights**!

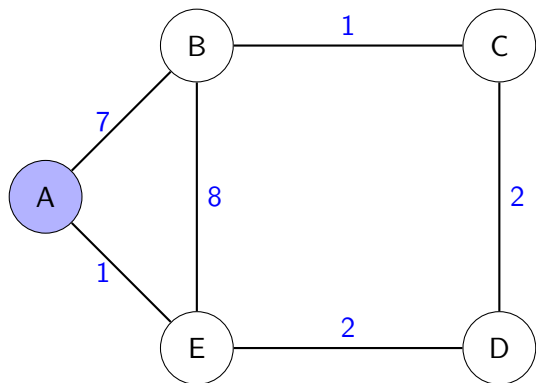
$$\hookrightarrow d_X(Y) = \min_V \{c(X, V) + d_V(Y)\}$$



	TO				
FROM	A	B	C	D	E
A	0	7	-	-	1
B	7	0	1	-	8
C	-	1	0	2	-
D	-	-	2	0	2
E	1	8	-	2	0

What Are We Dealing With?

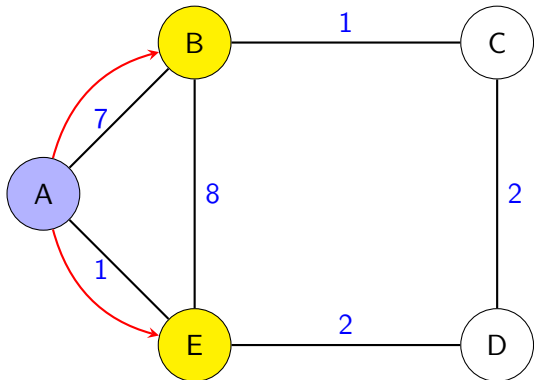
Calculate **shortest paths** from each node X_i to each other node Y_j !



	TO				
FROM	A	B	C	D	E
A	0	7	-	-	1
B	7	0	1	-	8
C	-	1	0	2	-
D	-	-	2	0	2
E	1	8	-	2	0

What Are We Dealing With?

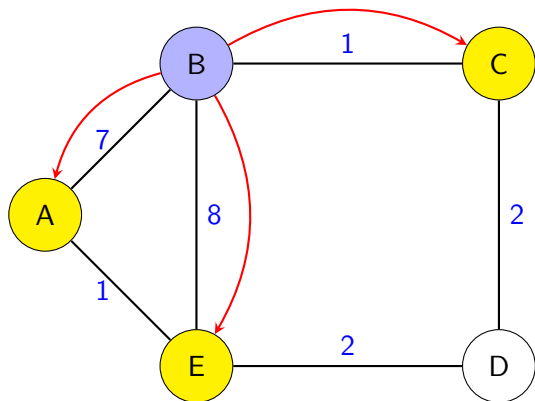
Works on the principle of “tell your neighbours how you see the world”



	TO				
FROM	A	B	C	D	E
A	0	7	-	-	1
B	7	0	1	-	8
C	-	1	0	2	-
D	-	-	2	0	2
E	1	8	-	2	0

What Are We Dealing With?

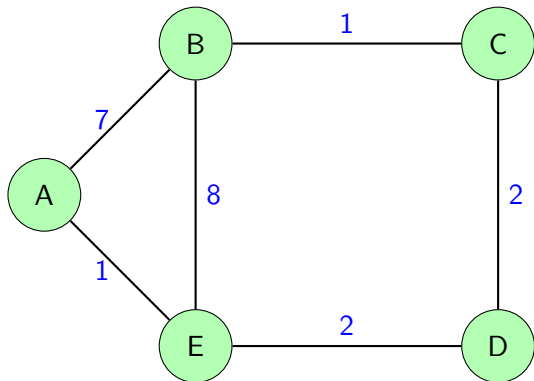
B communicates its **current distance vector** to neighbours A, C and E



	TO				
FROM	A	B	C	D	E
A	0	7	8	-	1
B	7	0	1	-	8
C	8	1	0	2	9
D	-	-	2	0	2
E	1	8	9	2	0

What Are We Dealing With?

...update distance vectors of **all routers** in the network **until convergence!**



	TO				
FROM	A	B	C	D	E
A	0	6	5	3	1
B	6	0	1	3	5
C	5	1	0	2	4
D	3	3	2	0	2
E	1	5	4	2	0

Plan Of Attack With SQL

- 1 **Schema:** *graph (from, to, via, cost)*

Plan Of Attack With SQL

- 1 **Schema:** *graph* (*from*, *to*, *via*, *cost*)
- 2 Perform a **recursive query** on a given graph

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Plan Of Attack With SQL

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$$d_X(Y) = \min_V \underbrace{\{c(X, V)\}}_{\text{neighbour } V} + \underbrace{\{d_V(Y)\}}_{\text{recursive part}}$$

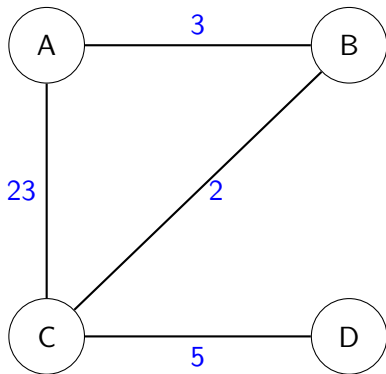
step 2
step 1

Plan Of Attack With SQL

Sample input table:

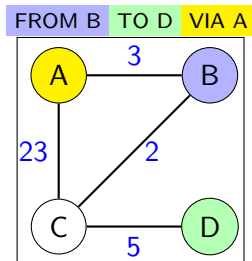
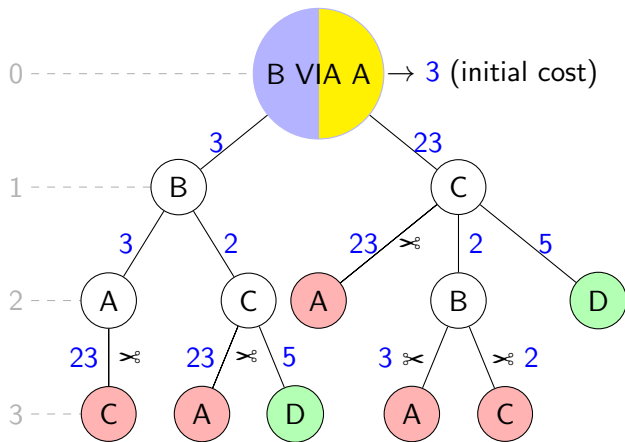
from	to	via	cost
A	B	B	3
A	B	C	Inf
A	C	B	Inf
A	C	C	23
A	D	B	Inf
A	D	C	Inf
⋮	⋮	⋮	⋮
⋮	⋮	⋮	⋮
D	C	C	5

Routing tables A, B, C, D



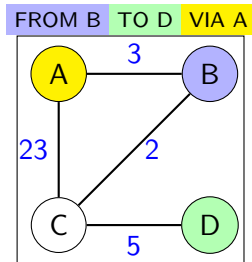
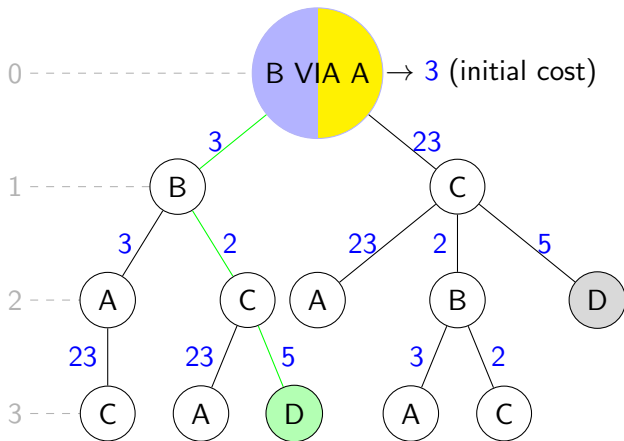
Plan Of Attack With SQL

Cut unnecessary paths with **branch and bound**:



Plan Of Attack With SQL

Do **branch and bound** for all **FROM X_i** **TO Y_i** **VIA V_i**



Non-Recursive Term

This way we know the start and destination of the track during the recursion steps

Copy those 3 columns

Finished iff to = via

from	to	via	cost next	track	total cost	b & b
A	B	B	3	{A,B,FINISHED}	3	3
A	B	C	23	{A,C}	23	Inf
A	C	C	23	{A,C, FINISHED}	23	23
A	D	B	3	{A,B}	3	Inf
A	D	C	23	{A,C}	23	Inf
⋮	⋮	⋮	⋮	⋮	⋮	⋮
D	A	C	5	{D,C}	5	Inf
D	B	C	5	{D,C}	5	Inf
D	C	C	5	{D,C,FINISHED}	5	5

Non-Recursive Term

```
CREATE OR REPLACE FUNCTION array_smallest(anyarray) RETURNS anyelement
LANGUAGE SQL AS $$
SELECT min(elements) FROM unnest($1) elements
$$;
```

```
1 WITH RECURSIVE exploration as (
2   SELECT
3     d.origin as initialization,           --from (static)
4     d.destination as final_destination, --to (static)
5     d.via as first_stopover,           --via (static)
6     d.origin,                          --from (dynamic)
7     d.destination,                    --to (dynamic)
8     d.via,                             --via (dynamic)
9     e.cost as cost_next_hop,
10    CASE
11      WHEN d.destination = d.via
12      THEN array[d.origin] || array[d.via] || array['FINISHED']::VARCHAR[]
13      ELSE array[d.origin] || array[d.via] END as track,
14    e.cost as total_cost,
15    CASE
16      WHEN d.destination = d.via
17      THEN d.cost
18      ELSE 'infinity' END as branch_and_bound
19  FROM graph as d, graph as e
20  WHERE d.origin = e.origin AND d.via = e.via AND e.destination = e.via --look at neighbour cost only

UNION ALL

...

```

Bellman-Ford perspective:

$$d_x(Y) = \min_v \underbrace{\{c(X, V)\}}_{\text{neighbour } v} + \underbrace{d_v(Y)}_{\text{recursive part}}$$

Recursive Term

Recursion depth: 0 **FROM A** **TO B** **VIA E** (Non-Recursive Term)

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion depth: 1 FROM A TO B VIA E

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion depth: 2 **FROM A TO B VIA E**

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion depth: 2 **FROM A TO B VIA E**

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion depth: 2 **FROM A TO B VIA E**

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion depth: 3 **FROM A TO B VIA E**

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

Recursion End: The most **cost-effective** path wins

from	to	via	cost next	track	total cost	b & b
A	B	E	1	{A,E}	1	Inf
E	D	D	2	{A,E,D}	3	9
E	C	C	5	{A,E,C}	6	9
E	B	B	8	{A,E,B,FINISHED}	9	9
E	A	A	1	{A,E,A}	2	9
A	B	B	7	{A,E,A,B,FINISHED}	9	7
D	C	C	2	{A,E,D,C}	5	7
C	D	D	2	{A,E,C,D}	8	7
C	B	B	1	{A,E,C,B,FINISHED}	7	7
C	B	B	1	{A,E,D,C,B,FINISHED}	6	6

Recursive Term

...

UNION ALL

```

1  SELECT
2      e.initialization,
3      e.final_destination,
4      e.first_stopover,
5      d.origin,
6      d.destination,
7      d.via,
8      d.cost,
9      CASE
10         WHEN e.final_destination = d.via
11             THEN e.track || array[d.via, 'FINISHED']::VARCHAR[]
12         ELSE e.track || array[d.via] END as track,
13     e.total_cost+d.cost as total_cost,
14     array_smallest(array[e.branch_and_bound]::float[] ||
15     array[min(CASE WHEN e.final_destination = d.via
16                 THEN e.total_cost+d.cost
17                 ELSE 'infinity' END) over win]::float[]) as branch_and_bound
18 FROM exploration as e, graph as d
19 WHERE e.via = d.origin AND
20        d.destination = d.via AND
21        'FINISHED' <> ALL(e.track) AND
22        (SELECT cardinality(array_positions(e.track[2:],d.via)) < 1) AND
23        e.total_cost+d.cost <= e.branch_and_bound
24 WINDOW win as (PARTITION BY e.initialization, e.final_destination, e.first_stopover
25                 ORDER BY e.total_cost RANGE BETWEEN UNBOUNDED PRECEDING AND UNBOUNDED FOLLOWING)
26 )

```

Bellman-Ford perspective:

$$d_x(Y) = \min_v \underbrace{\{c(X, V)\}}_{\text{neighbour } V} + \underbrace{\{d_v(Y)\}}_{\text{recursive part}}$$

Q

Recursive Term

```
SELECT
```

```
.
.
.
```

<pre>1 array_smallest(array[e.branch_and_bound>::float[] 2 array[min(CASE WHEN e.final_destination = d.via 3 THEN e.total_cost+d.cost 4 ELSE 'infinity' END) over win]::float[]) 5 as branch_and_bound</pre>	<pre>--min[b_and_b(t-1),b_and_b(t)] --across finished paths only</pre>
<pre>6 FROM exploration as e, graph as d 7 WHERE e.via = d.origin AND 8 d.destination = d.via AND 9 'FINISHED' <> ALL(s.track) AND 10 (SELECT cardinality(array_positions(e.track[2:],d.via)) < 1) AND 11 e.total_cost+d.cost <= s.branch_and_bound</pre>	<pre>--link last via with new origin --look one step ahead --only unfinished paths --recognize loops --do not violate upper bound</pre>
<pre>12 WINDOW win as (PARTITION BY e.initialization, 13 e.final_destination, 14 e.first_stopover 15 ORDER BY s.total_cost 16 RANGE BETWEEN UNBOUNDED PRECEDING AND UNBOUNDED FOLLOWING)</pre>	<pre>--define window function --partitions: --FROM X TO Y VIA V</pre>

After recursion...

Find path over minimum neighbour **VIA V_i** for all **FROM X_i TO Y_i**

```

1 SELECT
2   d.initialization,      --from
3   d.final_destination,  --to
4   d.minimal_cost,      --min cost d(x_i,y_i)
5   e.track               --protocol of the itinerary
6 FROM
7   (SELECT e.initialization,
8          e.final_destination,
9          e.first_stopover,
10         min(e.total_cost) as minimal_cost
11  FROM exploration as e
12  WHERE 'FINISHED' = e.track[array_upper(e.track,1)]
13  GROUP BY e.initialization, e.final_destination
14  ) as d, exploration as e
15 WHERE d.initialization = e.initialization AND
16        d.final_destination = s.final_destination AND
17        e.total_cost = d.minimal_cost AND
18        'FINISHED' = e.track[array_upper(s.track,1)]
19 ORDER BY d.initialization, d.final_destination;

```

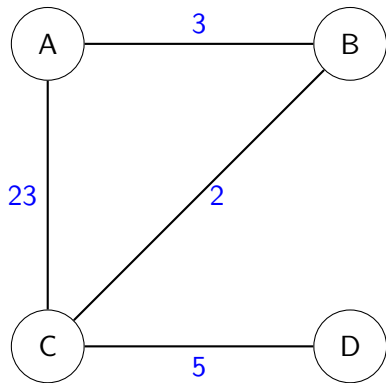
$$d_x(Y) = \min_V \underbrace{\{c(X, V)\}}_{\text{neighbour } V} + \underbrace{d_V(Y)}_{\text{recursive part}}$$

From recursive CTE find:

FROM X_i	TO Y_i	VIA V_1	COST C_1
FROM X_i	TO Y_i	VIA V_2	COST C_2
...
FROM X_i	TO Y_i	VIA V_n	COST C_n

$$\min \{C_1, C_2, \dots, C_n\} \forall X_i, Y_i$$

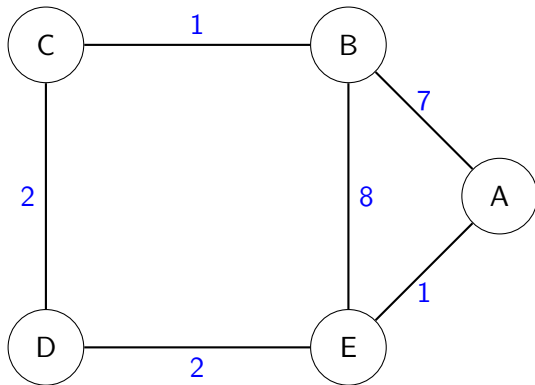
Live Demo With PostgreSQL



Final output:

from	to	min cost	track
A	B	3	{A,B,FINISHED}
A	C	5	{A,B,C,FINISHED}
A	D	10	{A,B,C,D,FINISHED}
B	A	3	{B,A,FINISHED}
B	C	2	{B,C,FINISHED}
B	D	7	{B,C,D,FINISHED}
C	A	5	{C,B,A,FINISHED}
C	B	2	{C,B,FINISHED}
C	D	5	{C,D,FINISHED}
D	A	10	{D,C,B,A,FINISHED}
D	B	7	{D,C,B,FINISHED}
D	C	5	{D,C,FINISHED}

Live Demo With PostgreSQL



Final output:

from	to	min cost	track
A	B	6	{A,E,D,C,B,FINISHED}
A	C	5	{A,E,D,C,FINISHED}
A	D	3	{A,E,D,FINISHED}
A	E	1	{A,E,FINISHED}
B	A	6	{B,C,D,E,A,FINISHED}
B	C	1	{B,C,FINISHED}
B	D	3	{B,C,D,FINISHED}
B	E	5	{B,C,D,E,FINISHED}
C	A	5	{C,D,E,A,FINISHED}
C	B	1	{C,B,FINISHED}
C	D	2	{C,D,FINISHED}
C	E	4	{C,D,E,FINISHED}
D	A	3	{D,E,A,FINISHED}
D	B	3	{D,C,B,FINISHED}
D	C	2	{D,C,FINISHED}
D	E	2	{D,E,FINISHED}
E	A	1	{E,A,FINISHED}
E	B	5	{E,D,C,B,FINISHED}
E	C	4	{E,D,C,FINISHED}
E	D	2	{E,D,FINISHED}

Any Questions? 😊

Key takaways:

- Perform a **recursive query** on a given graph
- Keep track of the **summed edge costs**
- Explore **lucrative** paths only:
Build in **cycle detections** & **upper bounds**

