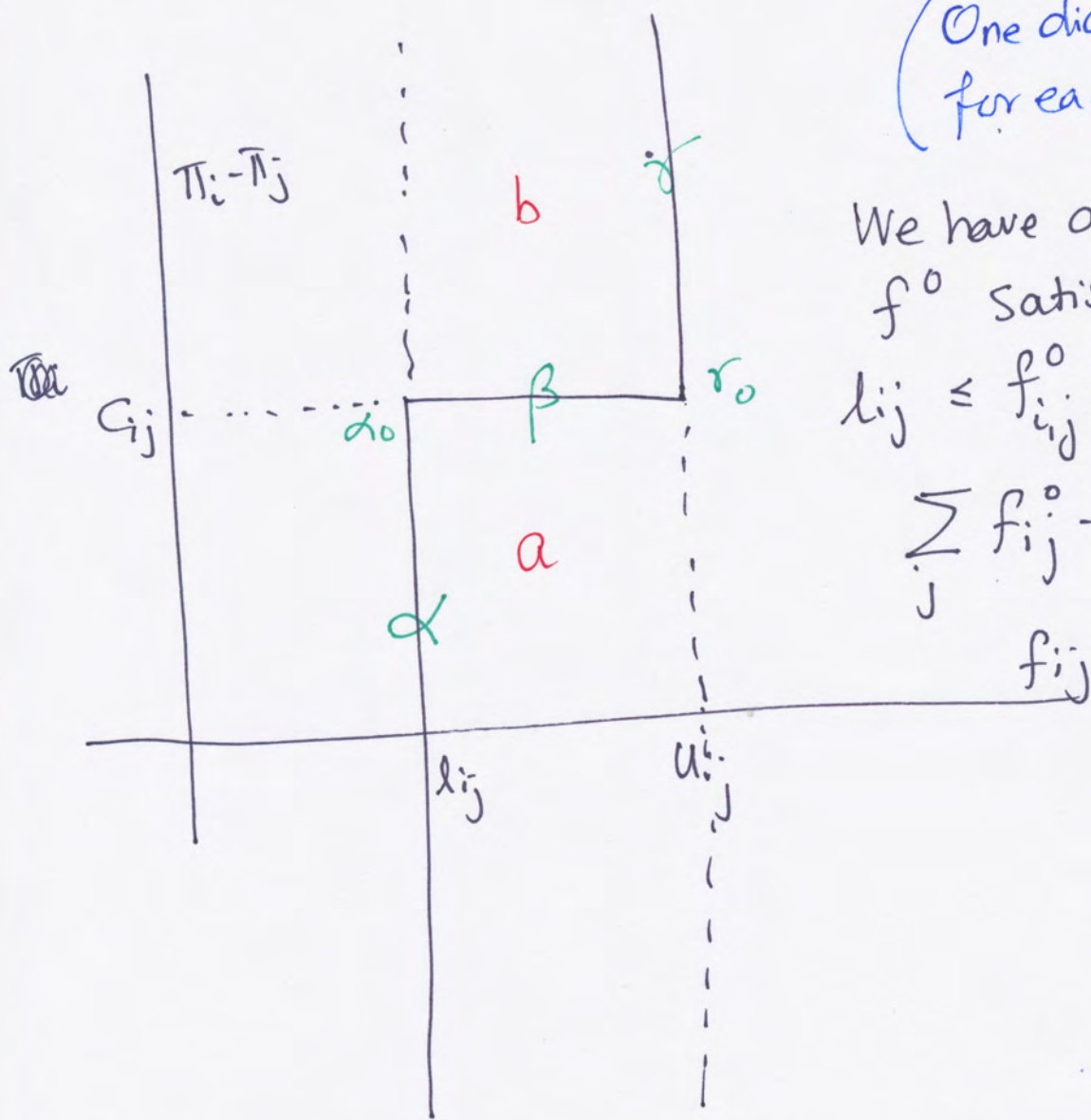


Recall : ~~CS~~ C-S diagrams

(One diagram for each edge)



We have assumed that f^0 satisfies

$$l_{ij} \leq f_{ij}^0 \leq u_{ij}$$

$$\sum_j f_{ij}^0 - \sum_j f_{ji}^0 = q_i \quad i \in V$$

Such f^0 can be found using max flow type algorithm with lower & upper bounds and external flows.

This is done only for convenience; it is NOT required.

If all $(i,j) \in E$ are in states $\alpha, \alpha_0, \beta, r, r_0$; f^0 is optimal

Our algorithm progresses towards making all edges to be in one of $\{\alpha, \alpha_0, \beta, \tau, \tau_0\}$ states. Starting from a solution that may not satisfy this condition. This algorithm is called (by FF)

Out-of-kilter algorithm. States $\alpha, \alpha_0, \beta, \tau, \tau_0$ are said to be in-kilter and a, b are said to be out-of-kilter. [The name comes from this]

Now we describe one possible version of this algorithm.

Out-of-kilter algorithm:

Step 1: Start with f^0 satisfying

$$l_{ij} \leq f_{ij}^0 \leq u_{ij} \quad \forall (i,j) \in E$$

$$\sum_j f_{ij} - \sum_j f_{j,i} = q_i \quad i \in V$$

(~~using~~ using, if needed, a max-flow type algorithm. If no such f^0 exists, this algorithm will show that and our min-cost flow problem is infeasible and we stop)

Here after, we use two subroutines:

I. Flow change subroutine

ii. Dual variable change subroutine.

[Please note x_{ij} , y_{ij} in (D) are implicit;

for any $\{\pi_i\}$, define $x_{ij} = \max(C_{ij} - (\pi_i - \pi_j), 0)$

$y_{ij} = \max(\pi_i - \pi_j - C_{ij}, 0)$

at most

Exactly one of the pair $\{x_{ij}, y_{ij}\}$ can be positive.]

We describe these two subroutines and when we switch between the two. But the overriding idea is NEVER allow an edge in-kilter to go out-of-kilter; more edges that are out-of-kilter "close" to in-kilter.

- As such, flow is not permitted to change
- for edges in state d or r
 - for edges in state a, b , flow is only allowed to increase (within limits)
 - for edges in state s, a flow is only permitted to decrease (within limits)

(d) for edges in State β flow is ~~a~~ permitted (4)
to either increase or decrease within limits.

During Dual Variable changes:

(e) $(\pi_i - \pi_j)$ is allowed to increase without limit
for edges in State γ, γ_0

(f) $(\pi_i - \pi_j)$ is allowed to decrease without
limit for edges in State α, α_0 .

(g) $(\pi_i - \pi_j)$ is not allowed to increase for
edges in State α_0, b .

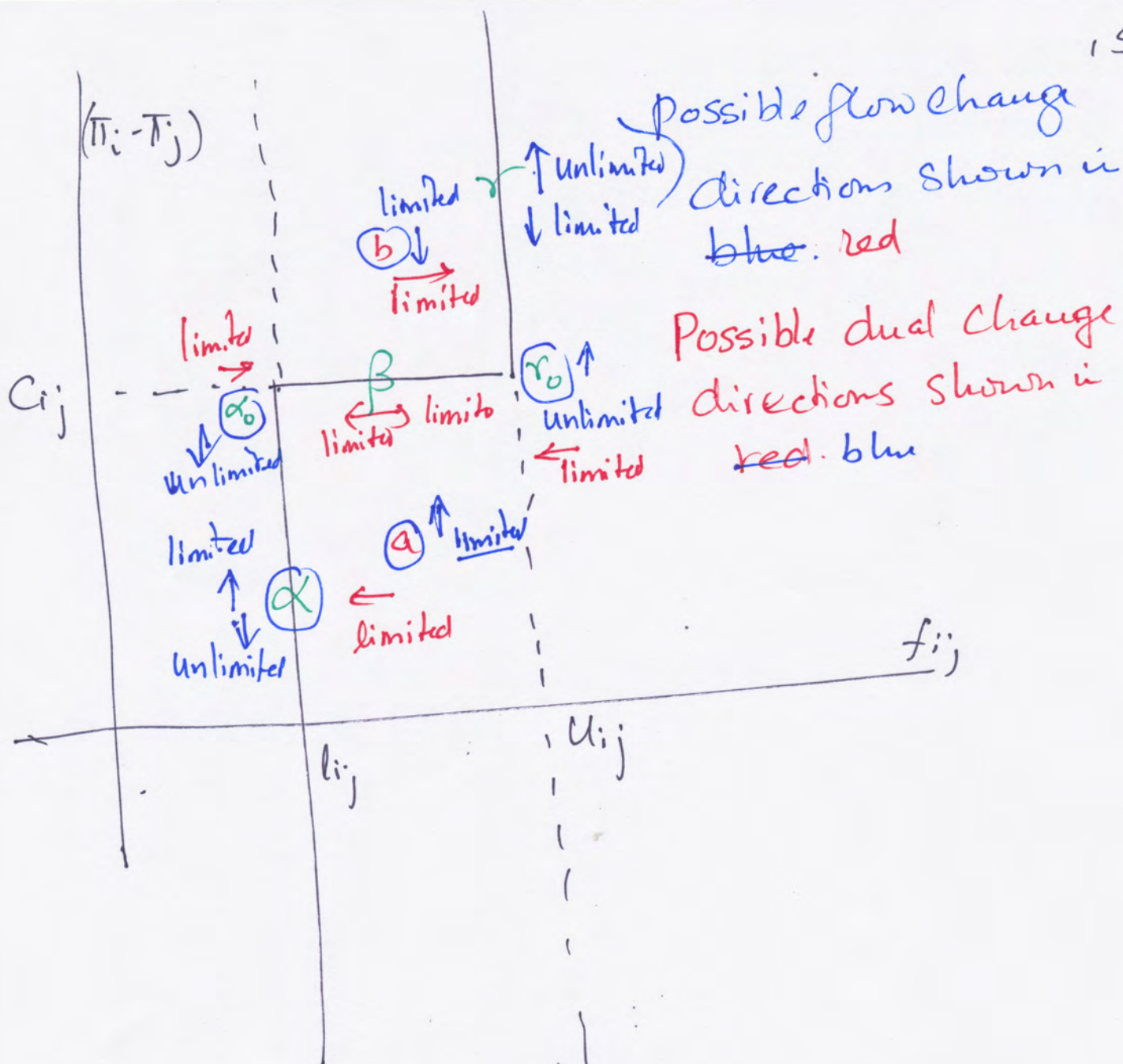
(h) $(\pi_i - \pi_j)$ is not allowed to decrease for
edges in State γ_0, a

(i) $(\pi_i - \pi_j)$ is not allowed to change for edges
in State β

(j) For edges in states $\left\{ \begin{matrix} \gamma, b \\ \alpha, a \end{matrix} \right\}$ $(\pi_i - \pi_j)$ can decrease
within limits

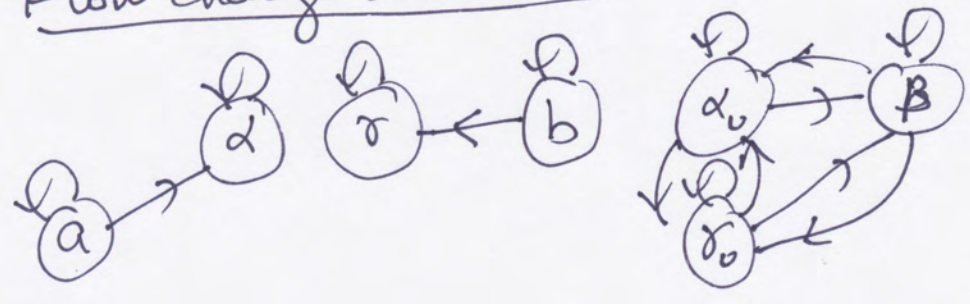
(k) For edges in States (α, a) , $(\pi_i - \pi_j)$ can
increase within limits.

These permitted changes are shown in
the diagram on the next page

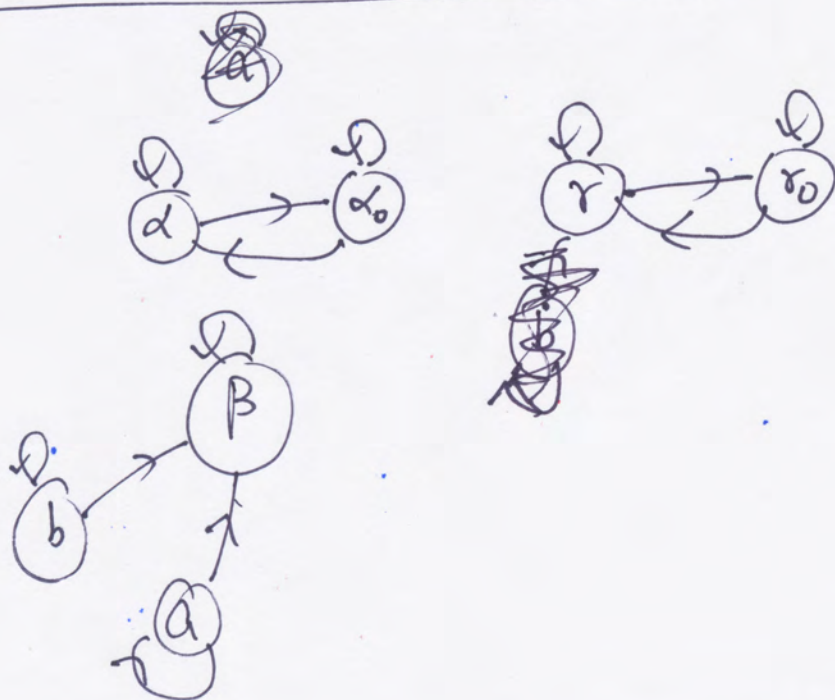


Possible State transitions

Flow change subroutine



Dual Variable Change Subroutine



Whenever an edge goes from $\{a, b\}$ to $\{\alpha_0, \alpha, \beta, \gamma_0, \gamma\}$
 we decrease the number of edges that are out-of-kilter.

Else we decrease another measure called
Kilter-Number that shows we are making
 progress towards optimality.

Kilter-Number can be defined several ways
 and we get appropriate versions of the
 algorithm. We define these in the
 next page.

The one used in FF-book: first.

(7)

For edges in states $\{\alpha, \alpha_0, \beta, \delta, \tau_0\}$ Kilter-number is 0. If $\sum_{ij \in E} k_{ij} = 0$, we have optimality.

For edge^(s) in state a: $[f_{ij} - l_{ij}] \cdot [c_{ij} - (\bar{\pi}_i - \bar{\pi}_j)]$

b: $[u_{ij} - f_{ij}] \cdot [(\bar{\pi}_i - \bar{\pi}_j) - c_{ij}]$

In either case Kilter number is positive for edges in state (a) or (b). Hence $\sum k_{ij} = 0$, no edge is out-of-Kilter & hence optimality.

This is our goal and we never let $\sum_{ij \in E} k_{ij}$ increase in our algorithm.

We decrease it at each step.

Now describe our algorithm. It starts with the selection of an edge in state a or b and attempts to bring it in-Kilter while not allowing any edge to go out-of-Kilter. (Even other edges may decrease k_{ij} in the process)

Suppose we have a feasible flow f^0

$$i.e. \quad l_{ij} \leq f_{ij}^0 \leq u_{ij} \quad \forall (i,j) \in E$$

$$\sum_j f_{ij}^0 - \sum_j f_{ji}^0 = q_i \quad \forall i \in V$$

Let $\{\pi_i^0\}$ be chosen arbitrarily.

For this (f^0, π^0) , we can find the state of each edge. If none are in $\{a, b\}$, then

we are done. f^0 is opt for P

π^0 is opt for D

(with suitably defined x^0, y^0)

So suppose not. Let edge (p, q) be in state a without loss. (Similar methods with suitable modification apply if (p, q) is in state ~~a~~ b)

Flow changes: Desirable to decrease flow on (p, q) if it is in state a ^(increase)

But to do this, we need to increase flow on some admissible path from p to q. _(b)

Consider a "residual" graph $G^{(f^0, \pi^0)}$ as follows: (9)

$$(i, j) \in E^{(f^0, \pi^0)} \Leftrightarrow \begin{cases} (i, j) \in E; \text{ state: } \alpha_0, \beta, b \\ \text{(OR)} \\ (j, i) \in E; \text{ state } \tau_0, \beta, a \end{cases}$$

Residual capacities: $\left\{ \begin{array}{l} \text{for } (i, j) \in E; \text{ state } \alpha_0, \beta, b \\ \text{in dir } i \rightarrow j \\ U_{ij} - f_{ij} > 0 \\ \text{for } (j, i) \in E; \text{ state } \tau_0, \beta, a \\ f_{ij} - l_{ij} > 0 \quad \square \end{array} \right.$

Origin p , destination q , in state a

Send min $\left\{ \begin{array}{l} \text{max flow in } G^{(f^0, \pi^0)} \text{ from } p \text{ to } q; \\ f_{p,q}^0 - l_{p,q} > 0 \end{array} \right.$

$$f_{p,q}^0 - l_{p,q} > 0$$

If the above min = $f_{p,q}^0 - l_{p,q}$; $(p, q) \rightarrow$ State α

One more edge in filter.

If not, \exists a min-cut in $G^{(f^0, \pi^0)}$ separating p and q

$$\downarrow \\ (S, \bar{S})$$

$$\pi_i^{\text{new}} = \begin{cases} \pi_i^{\text{old}} + \delta & i \in S \\ \pi_i^{\text{old}} & i \in \bar{S} \end{cases} \quad \left. \vphantom{\pi_i^{\text{new}}} \right\} \begin{array}{l} \text{Where } \delta \text{ is given} \\ \text{by (next page)} \end{array}$$

$$\text{Let } \delta_1 = \min_{\substack{(i,j): r, b \\ i \in \bar{S}, j \in S}} \{ \pi_i - \pi_j - c_{ij} \} > 0$$

$$\delta_2 = \min_{\substack{\alpha, a \\ i \in S \\ j \in \bar{S}}} \{ c_{ij} - (\pi_i - \pi_j) \} > 0$$

$$\delta = \text{Min}(\delta_1, \delta_2)$$

[At max flow $< (f_{p,q}^0 - l_{p,q})$,

$i \in S$: ~~Reachable~~ reachable from p

$i \in \bar{S}$: not " " " "

$p \in S, q \in \bar{S}$

~~i, j~~ $i \in S, j \in \bar{S} : \Rightarrow (i,j)$ in states: r, r_0, a, α

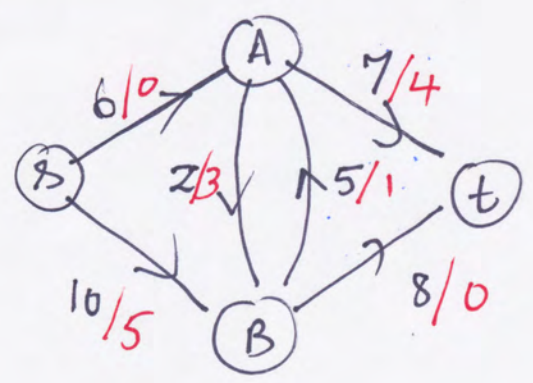
$i \in \bar{S}, j \in S : \Rightarrow (i,j)$ " " α_0, α, b, r

$$\pi_i^{\text{new}} - \pi_j^{\text{new}} = \begin{cases} \pi_i^{\text{old}} - \pi_j^{\text{old}} & i \in S, j \in \bar{S} \\ \pi_i^{\text{old}} - \pi_j^{\text{old}} + \delta \uparrow & i \in S, j \in \bar{S} : \begin{matrix} \text{unlimited} \\ r, r_0 \\ \alpha, a \\ \text{in} \\ \text{limit} \end{matrix} \\ \pi_i^{\text{old}} - \pi_j^{\text{old}} - \delta \downarrow & i \in \bar{S}, j \in S : \begin{matrix} \alpha_0, \alpha \\ \text{unlimited} \\ b, r \\ \text{limit} \end{matrix} \end{cases}$$

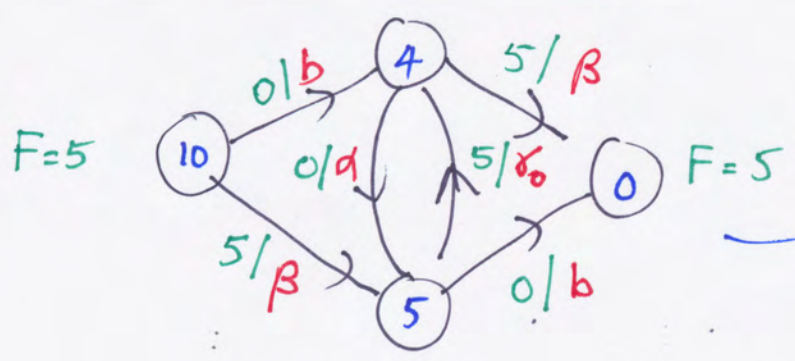
After each dual variable change, we go back to flow changes (possibly many aug. paths)

Increases size of BFS-tree at each step if no flow increase results.

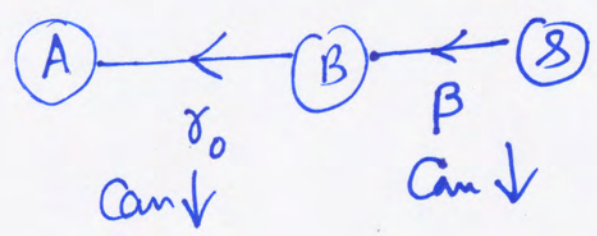
An Example :



- $l_{ij} = 0 \quad \forall (i,j) \in E$
- u_{ij} : black
- f_{ij} : green
- C_{ij} : Cost
- π_i : blue
- State : Red

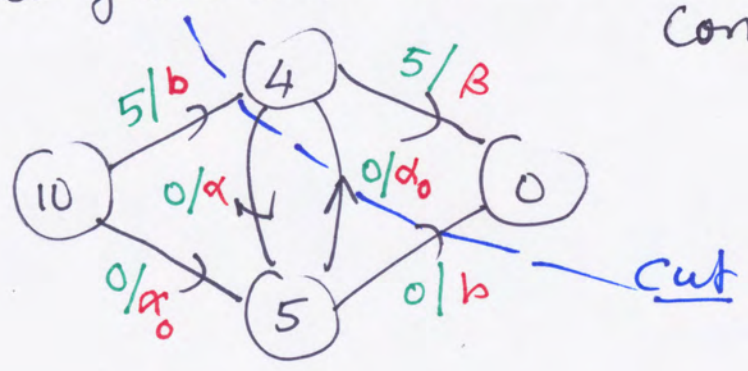


Select edge (s,A)
 in state b : Want to
 ↑ flow on (s,A)
 So find an admissible
 path from A to s



So decrease by 5 units on (s,B) , (B,A) and
 increase on (s,A) by 5 units.

New flows and States



Continue with (s,A) in
 state b.

$\delta_1 =$
 $\delta_2 =$

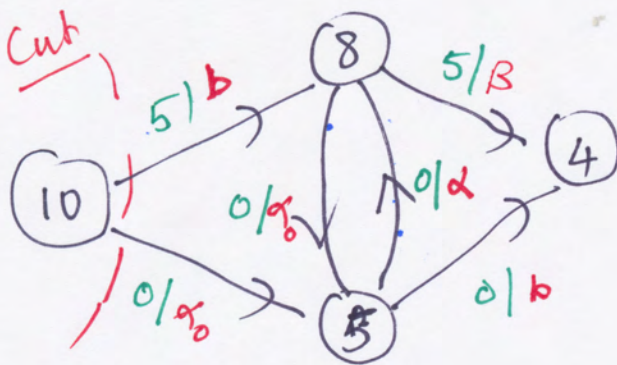
Dual Variable Change

$$S = \{A, t\}, \quad \bar{S} = \{s, B\}$$

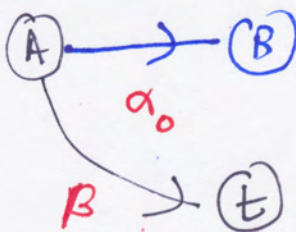
$$\delta_1 = \text{Min} \left[\begin{array}{l} 10-4-0 \\ (s, A) \\ \text{State b} \end{array} \right], \quad \left. \begin{array}{l} 5-0-0 \\ (B, t) \\ \text{State b} \end{array} \right] = 5$$

$$\delta_2 = \text{Min} \left[\begin{array}{l} 3-(4-5) \\ (A, B) \\ \text{State } \alpha \end{array} \right] = 4$$

$$\delta = \text{Min}(\delta_1, \delta_2) = 4.$$



Continue with (s, A) in State b:
So try to find an admissible path from A to s



$$S = \{A, B, t\}, \quad \bar{S} = \{s\}$$

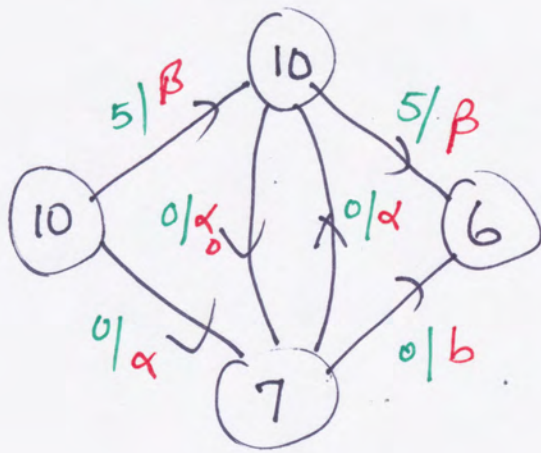
$$\delta_1 = \text{Min} [10-8-0] = 2$$

(s, A) in State b

$$\delta_2 = \infty$$

$$\delta = 2:$$

Dual Variable change.

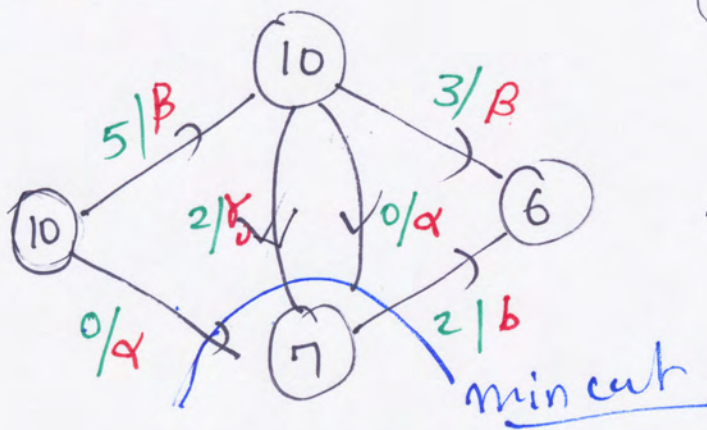


edge (8,A) now in-kilter

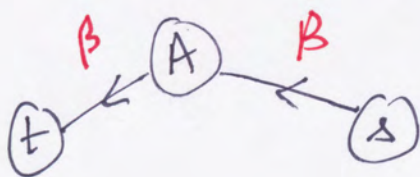
So we next take up edge (B,t) in state b. Again want to ↑ flow on (B,t). So try to find an admissible path from t to B.

t - A - B : 2 (limited by A, B)

New flows:



Continue to try to ↑ flow on (B,t) in State b.



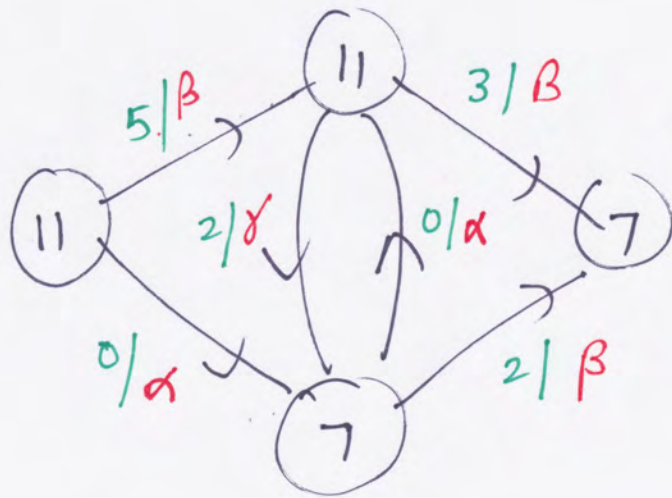
$$S = \{8, A, t\} \quad \{B\} = \bar{S}$$

$$\delta_1 = \text{Min} \left[\begin{matrix} 7 - b - 0 \\ (B, t) \\ \text{in state b} \end{matrix} \right] = 1$$

$$\delta_2 = \text{Min} [10 - 7 - 1] = 2$$

$$\delta = 1$$

Dual Variable Change



Optimal Solution to

(P) and (D)

End

Each Flow Subroutines are strongly polynomial.

of dual variable changes without changing flows is also $\leq |V|$. Since BFS tree enlarges at each step. The only issue is that

the number of alternative cycles of flow-change - dual variable change - flowchange...

seems not to have an appropriate bound

To rectify this we use "Scaling" techniques

(very much like "bit" operations in CS)

This is due to J. Edmonds & R.M. Karp

And we take this up next.