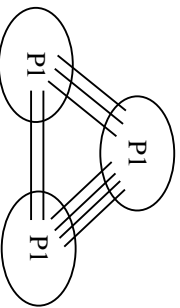


### Network Flow Based Partitioning

- Min-cut balanced partitioning: Yang and Wong, ICCAD'94.
  - Based on max-flow min-cut theorem.



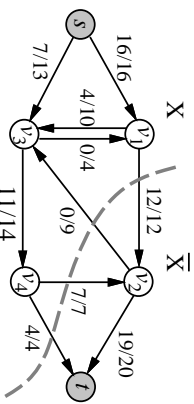
- Gate replication for partitioning: Yang and Wong, ICCAD'95.
- Performance-driven multiple-chip partitioning: Yang and Wong, FPGA'94, ED&TC'95.
- Multi-way partitioning with area and pin constraints: Liu and Wong, ISPD'97.
- Multi-resource partitioning: Liu, Zhu, and Wong, FPGA'98.
- Partitioning for time-multiplexed FPGAs: Liu and Wong, ICCAD'98.

### Max-Flow Min-Cut

- A **cut**  $(X, \bar{X})$  of flow network  $G = (V, E)$  is a partition of  $V$  into  $X$  and  $\bar{X} = V - X$  such that  $s \in X$  and  $t \in \bar{X}$ .
  - **Capacity of a cut:**  $cap(X, \bar{X}) = \sum_{u \in X, v \in \bar{X}} c(u, v)$ . (Count only forward edges!)

- **Max-flow min-cut theorem** Ford & Fulkerson, 1956.

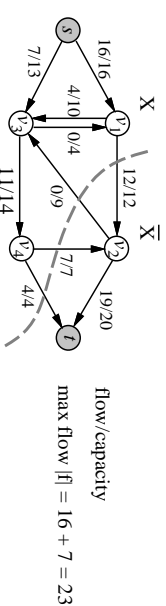
–  $f$  is a max-flow  $\iff |f| = cap(X, \bar{X})$  for some min-cut  $(X, \bar{X})$ .



Flow/capacity  
 max flow  $|f| = 16 + 7 = 23$   
 cap( $X, \bar{X}$ ) =  $12 + 7 + 4 = 23$

### Flow Networks

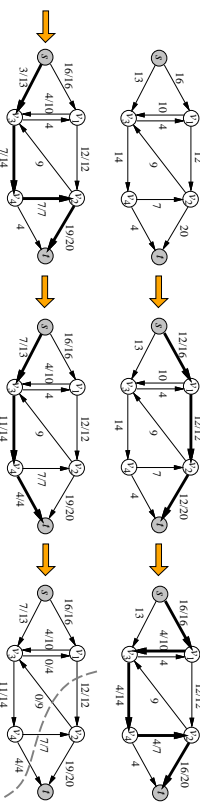
- A **flow network**  $G = (V, E)$  is a directed graph in which each edge  $(u, v) \in E$  has a **capacity**  $c(u, v) > 0$ .
- There is exactly one node with no incoming (outgoing) edges, called the **source**  $s$  (**sink**  $t$ ).
- A **flow**  $f : V \times V \rightarrow R$  satisfies
  - **Capacity constraint:**  $f(u, v) \leq c(u, v), \forall u, v \in V$ .
  - **Skew symmetry:**  $f(u, v) = -f(v, u), \forall u, v \in V$ .
  - **Flow conservation:**  $\sum_{v \in V} f(u, v) = 0, \forall u \in V - \{s, t\}$ .
- The **value** of a flow  $f : |f| = \sum_{v \in V} f(s, v) = \sum_{v \in V} f(v, t)$
- **Maximum-flow problem:** Given a flow network  $G$  with source  $s$  and sink  $t$ , find a flow of maximum value from  $s$  to  $t$ .



Flow/capacity  
 max flow  $|f| = 16 + 7 = 23$

### Network Flow Algorithms

- An **augmenting path**  $p$  is a simple path from  $s$  to  $t$  with the following properties:
  - For every edge  $(u, v) \in E$  on  $p$  in the **forward** direction (a **forward edge**), we have  $f(u, v) < c(u, v)$ .
  - For every edge  $(u, v) \in E$  on  $p$  in the **reverse** direction (a **backward edge**), we have  $f(u, v) > 0$ .
- $f$  is a max-flow  $\iff$  no more augmenting path.



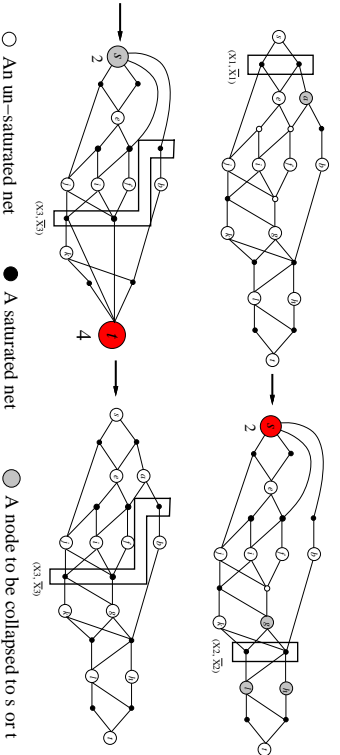
- First algorithm by Ford & Fulkerson in 1959:  $O(|E||f|)$ ; First **polynomial-time** algorithm by Edmonds & Karp in 1969:  $O(|E|^2|V|)$ ; Goldberg & Tarjan in 1985:  $O(|E||V| \lg(|V|^2/|E|))$ , etc.

### Network Flow Based Partitioning

- Why was the technique not wisely used in partitioning?
  - Works on graphs, not hypergraphs.
  - Results in unbalanced partitions; repeated min-cut for balance:  $|V|$  max-flows, time-consuming!
- Yang & Wong, *ICCAD'94*
  - Exact **net** modeling by flow network.
  - Optimal algorithm for min-net-cut bipartition (unbalanced).
  - Efficient implementation for repeated min-net-cut: same asymptotic time as **one** max-flow computation.

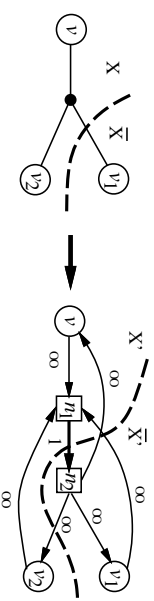
### Repeated Min-Cut for Balanced Bipartition (FBB)

- Allow component weights to deviate from  $(1-\epsilon)W/2$  to  $(1+\epsilon)W/2$ .

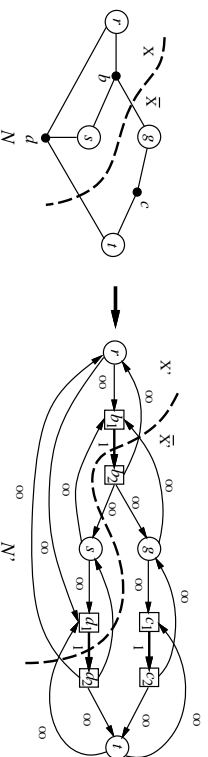


### Min-Net-Cut Bipartition

- Net modeling by flow network:

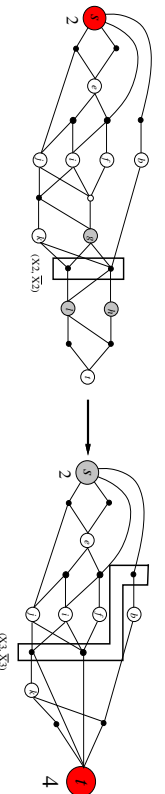


- A min-net-cut  $(X, \bar{X})$  in  $N \iff$  A min-capacity-cut  $(X', \bar{X}')$  in  $N'$ .
- Size of flow network:  $|V'| \leq 3|V|$ ,  $|E'| \leq 2|E| + 3|V|$ .
- Time complexity:  $O(\text{min-net-cut-size}) \times |E| = O(|V||E|)$ .



### Incremental Flow

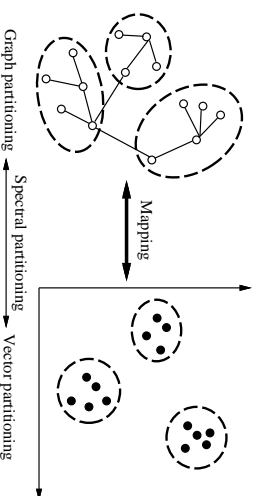
- Repeatedly compute max-flow: very time-consuming.
- No need to compute max-flow from scratch in each iteration.
- Retain the flow function computed in the previous iteration.
- Find additional flow in each iteration. Still correct.
- FBB time complexity:  $O(|V||E|)$ , same as **one** max-flow.
  - At most  $2|V|$  augmenting path computations.
  - \* At each augmenting path computation, either an augmenting path is found, or a new cut is found, and at least 1 node is collapsed to  $s$  or  $t$ .
  - \* At most  $|J| \leq |V|$  augmenting paths found, since bridging edges have unit capacity.
  - An augmenting path computation:  $O(|E|)$  time.



### Summary: Partitioning

- Partitioning objectives:
  - Hierarchical partitions
  - Reduction of cutsize
  - Balanced partition
- Other issues on partitioning:
  - **Performance-driven:** Rajaraman & Wong, DAC'93; Yang & Wong, FPGA'94.
  - **Capacity and pin constrained:** Murgai et al, ICCAD'91, etc.
  - **Clustering:** Cong et. al, ICCAD'97.
  - **Multiple types of resources constraints:** Betz and Rose, CICC'96; Liu & Wong, FPGA'98.

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### Partitioning: Other Approaches

- **Spectral method:** Barnes, *SIAM J. Algebraic and Discrete Methods*, 1982; Boppana, *FOCS*, 1987; Alpert & Kahng, DAC'95, DAC'96, etc.
- **Probabilistic approach:** Dutt & Deng, DAC'96, ISPD'98.
- Simulated evolution: Saab & Rao, DAC'90
- **Unified approach:** Network flow + Spectral, Li, Lillis, and Cheng, ICCAD'95.
- A good survey on partitioning: Alpert & Kahng, *Integration: The VLSI Journal*, 1995.

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