

习题五

7.6

Give an example of a linear program in two variables whose feasible region is infinite, but such that there is an optimum solution of bounded cost.

Objective function $\min x_1 + x_2$

Constraints $x_1, x_2 \geq 0$

7.7

- (a) Find necessary and sufficient conditions on the reals a and b under which the linear program $\max x + y$ $ax + by \leq 1$ $x, y \geq 0$ is infeasible

发现 $x = 0, y = 0$ 时恒满足约束条件，所以无论 a, b 取何值始终是feasible

7.7

- (b) Find necessary and sufficient conditions on the reals a and b under which the linear program $\max x + y$ $ax + by \leq 1$ $x, y \geq 0$ is unbounded.

$a \leq 0$ 时取 $x \rightarrow +\infty, y = 0$ 恒满足约束条件

$b \leq 0$ 时取 $x = 0, y \rightarrow +\infty$ 恒满足约束条件

当 $a > 0$ 且 $b > 0$ 时, 有 $x \leq \frac{1}{a}, y \leq \frac{1}{b}, x + y \leq \frac{1}{a} + \frac{1}{b}$ 有界

所以 $a \leq 0$ 或 $b \leq 0$ 时该线性规划无界

7.7

- (c) Find necessary and sufficient conditions on the reals a and b under which the linear program $\max x + y$ $ax + by \leq 1$ $x, y \geq 0$ has a unique optimal solution.

当 $a > 0$ 且 $b > 0$ 时, 该线性规划有最优解

当 $a = b$ 时, 该线性规划的最优解有无数个

所以当 $a > 0, b > 0$ 且 $a \neq b$ 时该线性规划有唯一最优解

7.9

A quadratic programming problem seeks to maximize a quadratic objective function (with terms like $3x_1^2$ or $5x_1x_2$) subject to a set of linear constraints. Give an example of a quadratic program in two variables x_1, x_2 such that the feasible region is nonempty and bounded, and yet none of the vertices of this region optimize the (quadratic) objective.

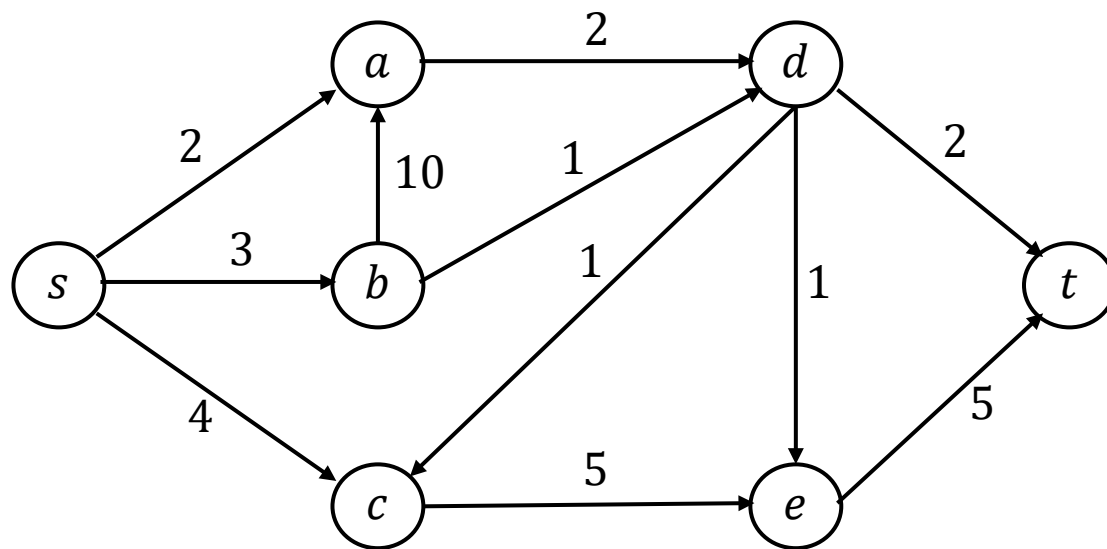
Objective function $\min x_1^2 + x_2^2$

Constraints $10 \geq x_1, x_2 > 0$

7.21

An edge of a flow network is called critical if decreasing the capacity of this edge results in a decrease in the maximum flow. Give an efficient algorithm that finds a critical edge in a network.

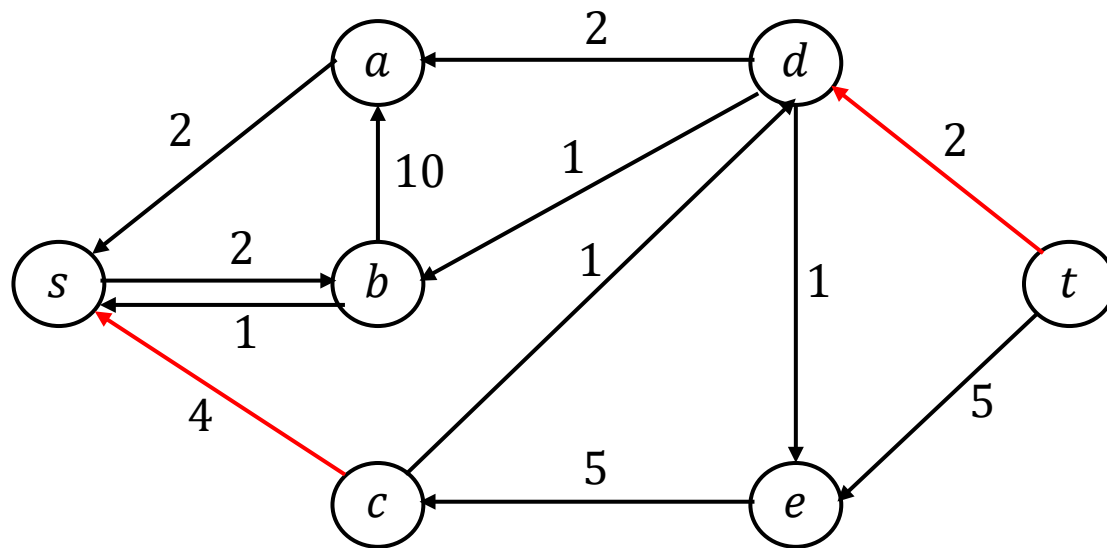
首先求最大流，再构造出残量图。显然，**临界边的容量肯定被占满**，所以在残量图中，**临界边的顶点对之间只存在反向边**。



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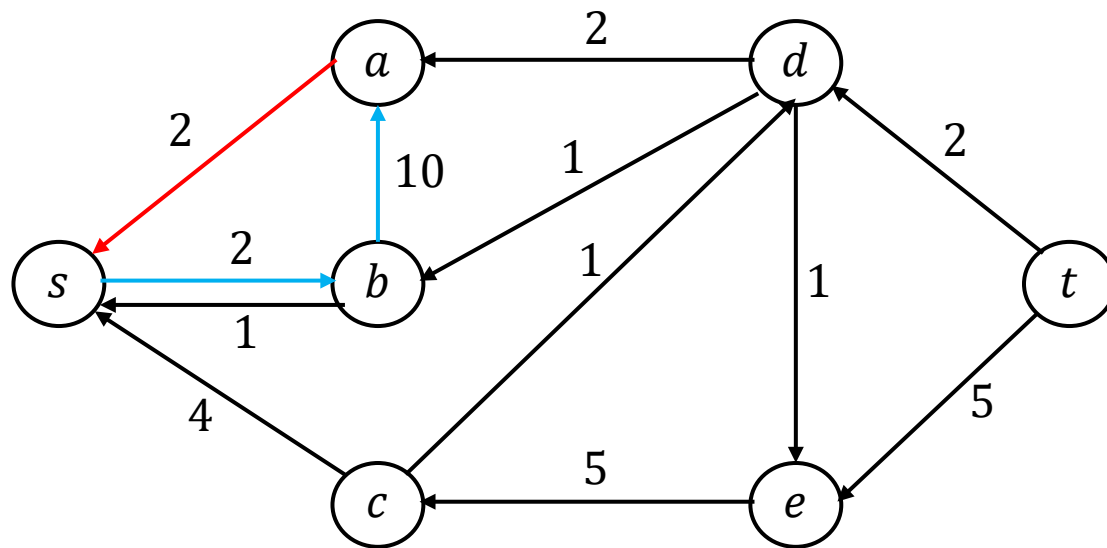
首先求最大流，再构造出残量图。显然，**临界边的容量肯定被占满**，所以在残量图中，**临界边的顶点对之间只存在反向边**。



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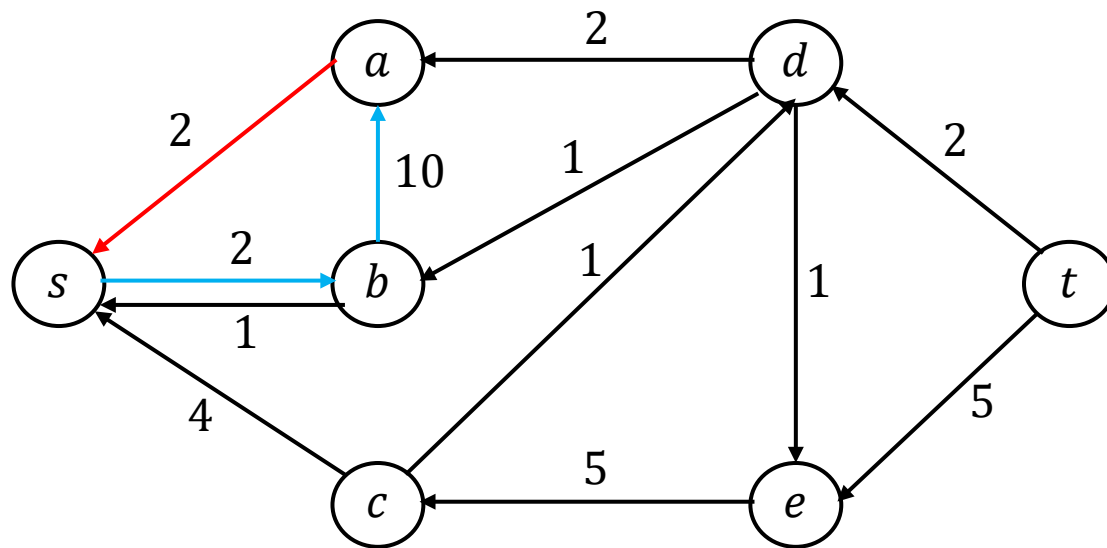
但在残量图中只存在反向边的顶点对不一定是临界边的顶点，可能某条在最大流中流满的边，其容量下降后，最大流中缺少的流量可以从其他边的流量得到补充



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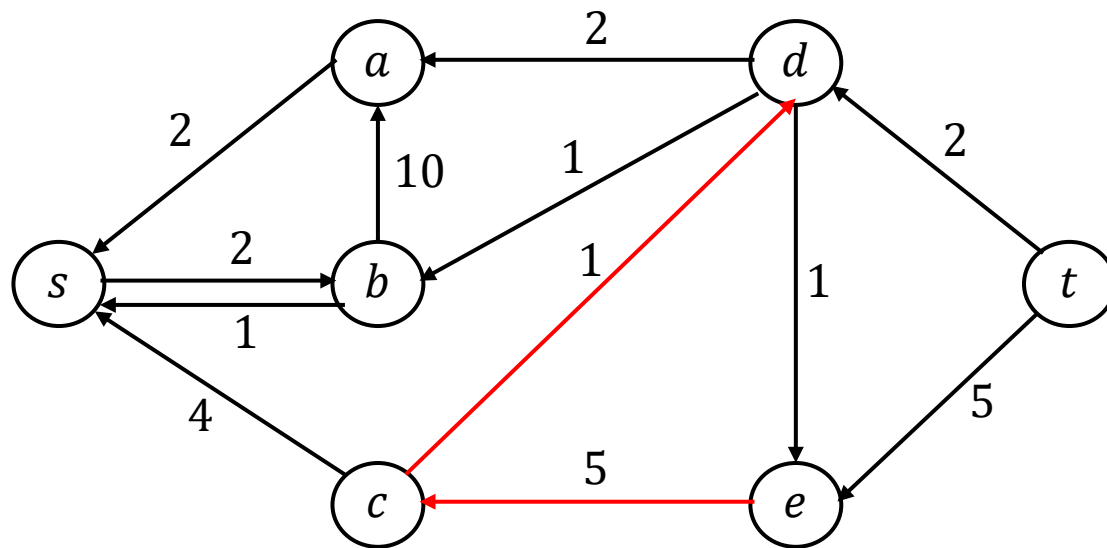
在残量图中以 s 为源点进行 *DFS*，则所经过的反向边均不是临界边（参考答案）



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An edge of a flow network is called critical if decreasing the capacity of this edge results in a decrease in the maximum flow. Give an efficient algorithm that finds a critical edge in a network.

在残量图中以 s 为源点进行 *DFS*，则所经过的反向边均不是临界边——**不正确**，因为没去除掉所有的非临界边的反向边

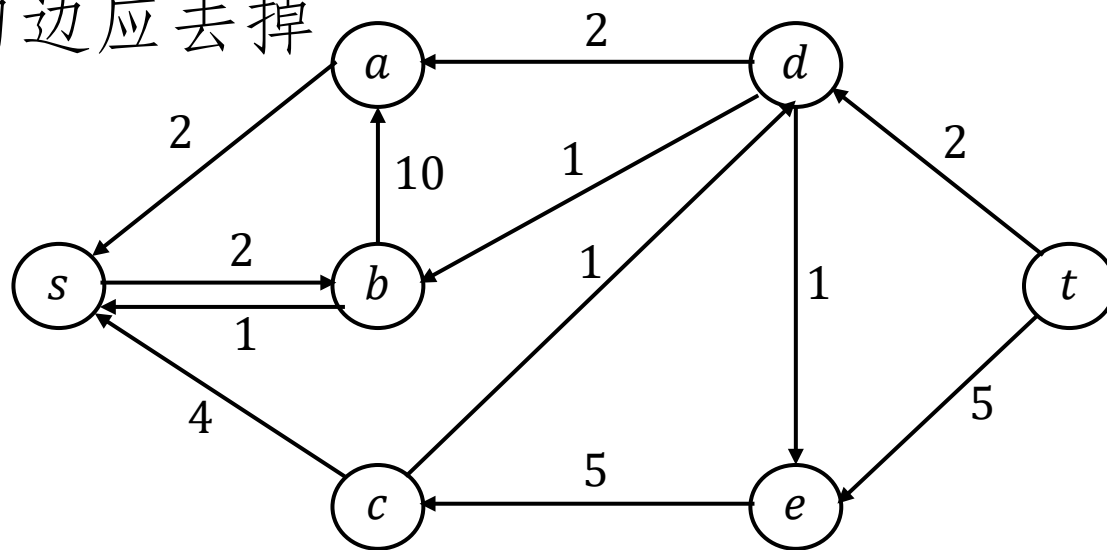


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An edge of a flow network is called critical if decreasing the capacity of this edge results in a decrease in the maximum flow. Give an efficient algorithm that finds a critical edge in a network.

(核心) 容量下降后，最大流中缺少的流量可以从其他边的流量得到补充

因此对每条反向边，从汇点 DFS ，若能 DFS 到源点，就说明该反向边应去掉

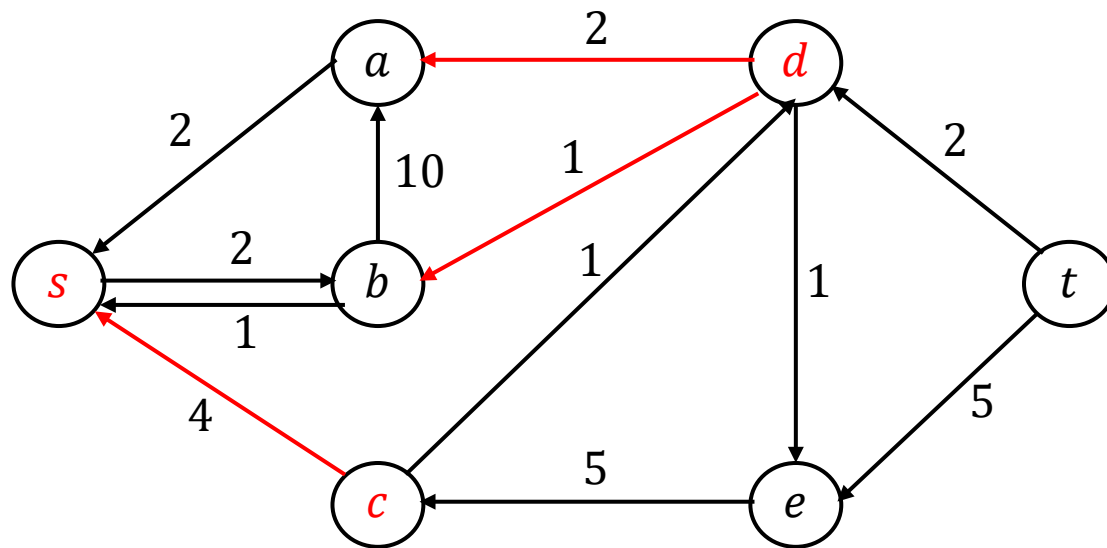


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(更好的方法) 源点的 DFS 因最小割而无法继续继续

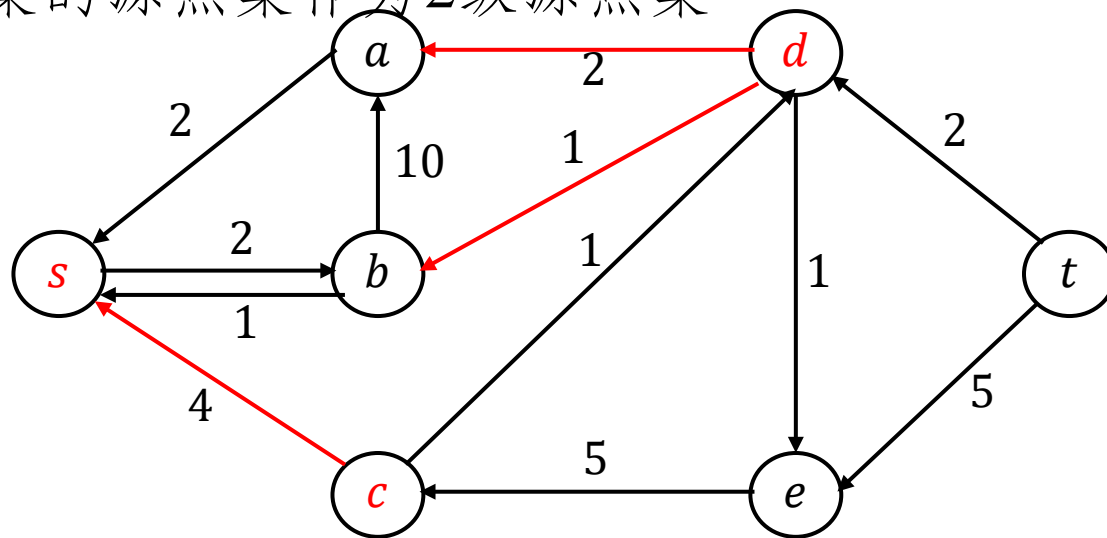
$e: a \rightarrow d$, $e: b \rightarrow d$ 和 $e: s \rightarrow c$ 均为临界边, 为继续求出不合格的反向边, 需要以为 c, d 为次级源点继续 DFS



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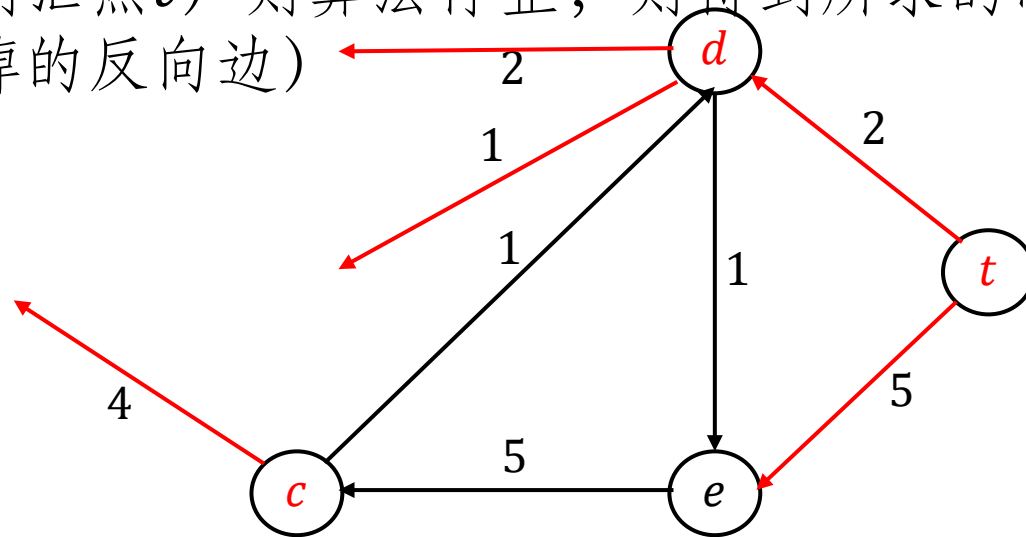
(更好的方法) 从源点开始 DFS ，遍历到的点集和未遍历到的点集形成图的一个割，割边集中所有的反向边均对应一条临界边；去掉遍历到的子图和割边集，得到了原图的一个未被遍历的子图，割边集的源点集作为2级源点集



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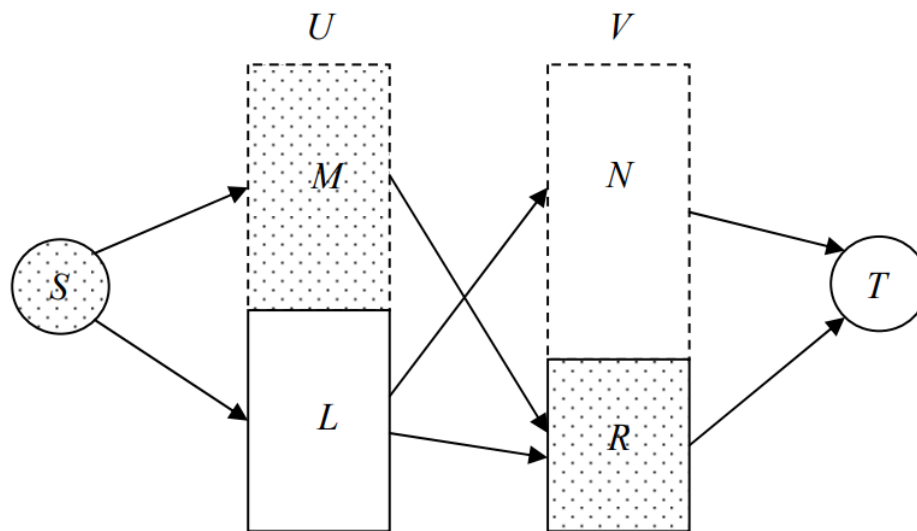
(更好的方法) 从 i 级源点继续 DFS ，若遍历到的点集和未遍历到的点集同样形成图的一个割，则重复上述操作，得到割边集、新的未被遍历的子图，作为 $i+1$ 级源点集；若遍历完整张（子）图（即遍历到汇点 t ）则算法停止，则得到所求的临界边集（或所有应该去掉的反向边）



7.23

Show that the problem of finding the minimum vertex cover in a bipartite graph reduces to maximum flow. (Hint: Can you relate this problem to the minimum cut in an appropriate network?)

答案的缺陷：找到的一组割
 $(S \cup M \cup R, L \cup N \cup T)$ = 最小点覆盖，但未证明该割即为最小割，因此还需要证明对任意一种割，其割边数 \leq 割 $(S \cup M \cup R, L \cup N \cup T)$ 的割边数（证明思路：讨论不属于 $S \rightarrow L$ 和 $R \rightarrow T$ 的割边，则添加新的割边会导致 $S \rightarrow L$ 和 $R \rightarrow T$ 中的割边减少，将割边数转移到节点数，利用最小点覆盖说明总割边数不减性）



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Show that the problem of finding the minimum vertex cover in a bipartite graph reduces to maximum flow. (Hint: Can you relate this problem to the minimum cut in an appropriate network?)

思路二：最小点覆盖 \Rightarrow 最小割

设二分图 $G = (U \cup V, E)$ ，则考察如下的线性规划：

Objective function $\min \sum_{u \in U} a_u + \sum_{v \in V} a_v$

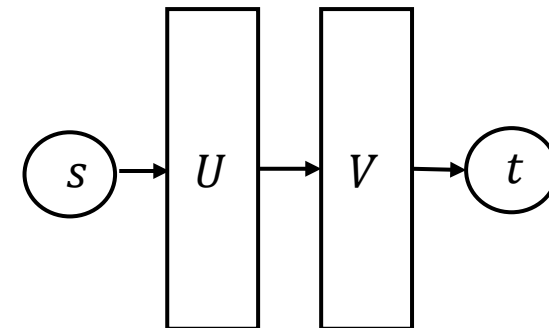
Constraints $u \in U, v \in V$

$\forall i \in U \cup V, a_i \in \{0, 1\}$

$a_u + a_v \geq 1$ ，若 $e: u \rightarrow v \in E$

可知该线性规划等价于 G 的最小点覆盖

且如右图所示网络，各边权为1，则该线性规划同样等价于该网络的最小割（证明，若 $e: u \rightarrow v \in E$ ，对流 $s \rightarrow u \rightarrow v \rightarrow t$ ，则 $s \rightarrow u$ ， $u \rightarrow v$ 和 $v \rightarrow t$ 三边至少取走一边，对应点 u, v 至少取走一个， a_u 和 a_v 至少一个为1，即对应 $a_u + a_v \geq 1$ ）



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Show that the problem of finding the minimum vertex cover in a bipartite graph reduces to maximum flow. (Hint: Can you relate this problem to the minimum cut in an appropriate network?)

思路三：最小点覆盖 \Rightarrow 最大匹配 \Rightarrow 最大流

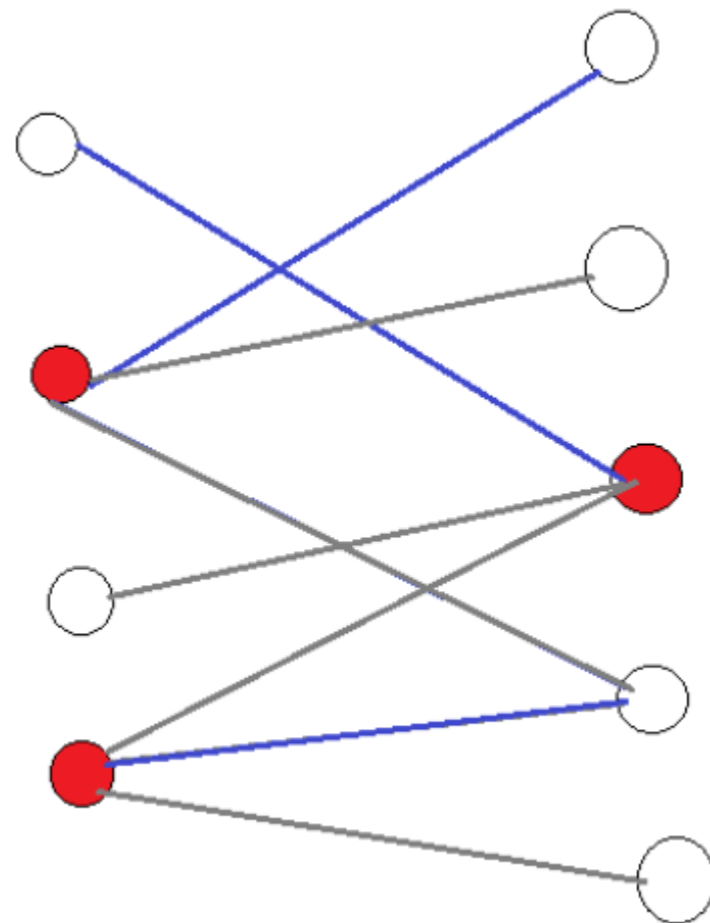
最小点覆盖数 \geq 最大匹配数

从左边非匹配点开始，延非匹配边走向右边的点；
右边的点再延匹配边走向左边，标记所有走过的点

左边未标记过的点和右边标记过的点集构成一个
最小点覆盖（证明：

1、选出来的点集大小 = 最大匹配

若左边选出的点存在非匹配点，则该点会作为
起点被标记；若右边选出的点存在非匹配点，则存
在一对非匹配点相连，得到一条新的匹配边，与最
大匹配矛盾）



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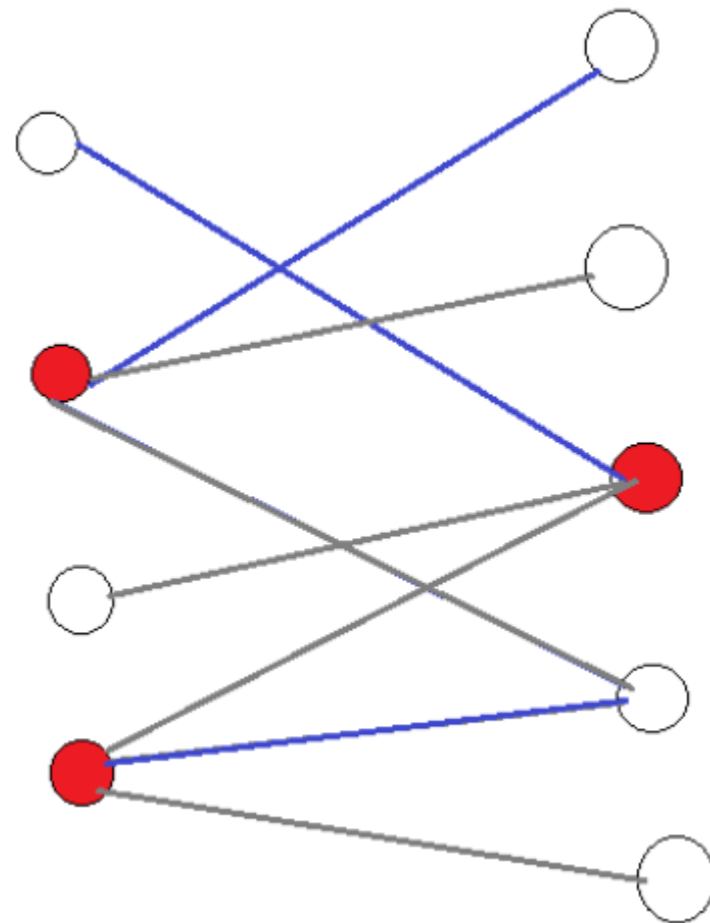
思路三：最小点覆盖 \Rightarrow 最大匹配 \Rightarrow 最大流

左边未标记过的点和右边标记过的点集构成一个最小点覆盖（证明：

2、选出来的点集可以覆盖所有边

因为不可能存在某一条边，其右端点没有标记，而左端点有标记的。

如果这条边不属于匹配边，那么右端点就可以通过这条边得到标记；如果这条边属于匹配边，那么左端点不可能是一条路径的起点，于是其标记只能是从这条边的右端点过来的，右端点就应该有标记。）



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Show that the problem of finding the minimum vertex cover in a bipartite graph reduces to maximum flow. (Hint: Can you relate this problem to the minimum cut in an appropriate network?)

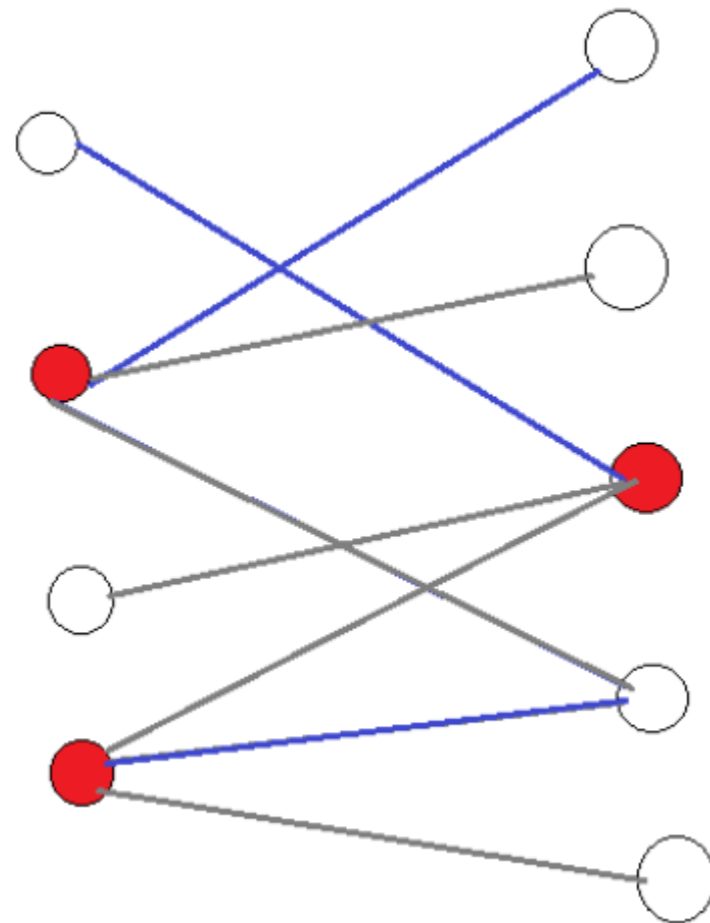
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- 1、选出来的点集大小=最大匹配
- 2、选出来的点集可以覆盖所有边
- 3、最小点覆盖数 \geq 最大匹配数

)

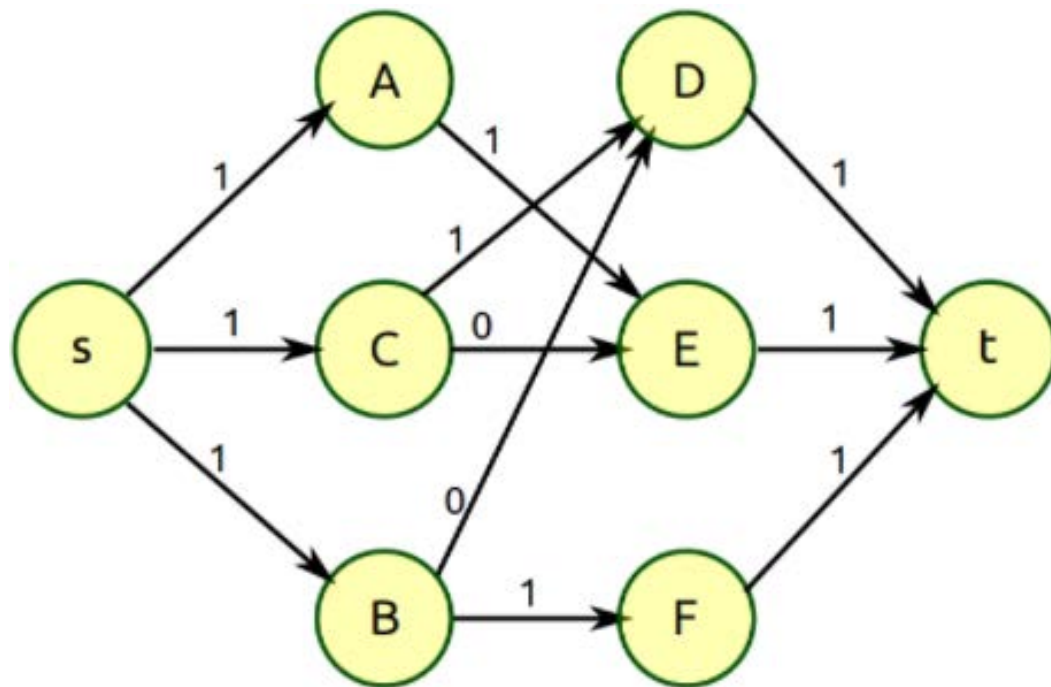
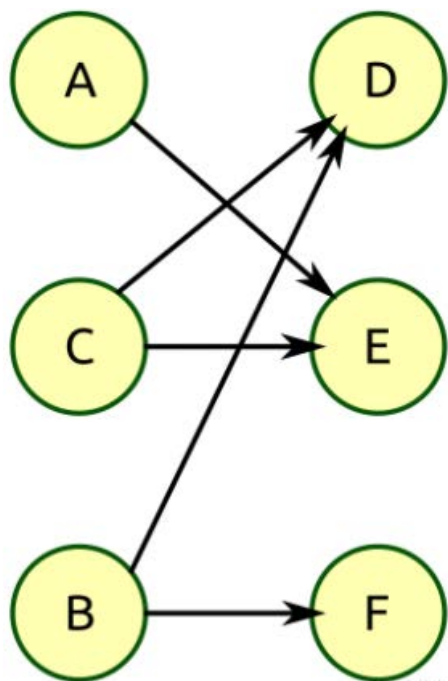
所以选出来的点集即构成最小点覆盖
最小点覆盖 \Rightarrow 最大匹配



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思路三：最小点覆盖 \Rightarrow 最大匹配 \Rightarrow 最大流
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7.30

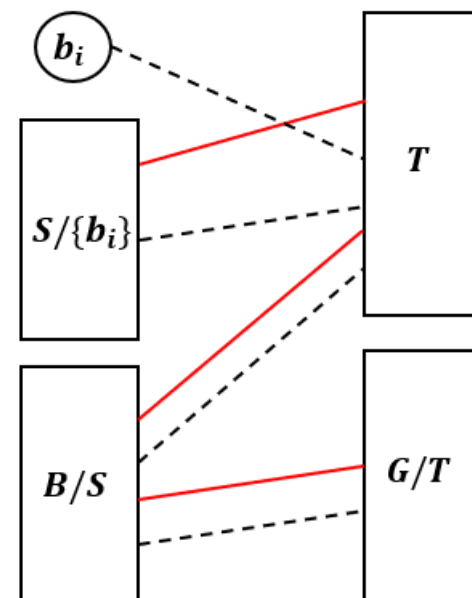
Hall's theorem. Returning to the matchmaking scenario of Section 7.3, suppose we have a bipartite graph with boys on the left and an equal number of girls on the right. Hall's theorem says that there is a perfect matching if and only if the following condition holds: any subset S of boys is connected to at least $|S|$ girls.

Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

必要性：（显然）

若存在 boys 子集 S ，与 S 相连的 girls 集合为 T ，满足 $|T| < |S|$ ，必然存在 $b_i \in S$ 在 S 与 T 的最大匹配中没有连边。

考察 boys 全集 B 和 girls 全集 G ， B 可拆分为 S 和 $B \setminus S$ ，其中 S 只与 T 相连， $B \setminus S$ 既与 $G \setminus T$ 相连也可能与 T 相连。由于 b_i 与 $G \setminus T$ 不连通，所以 b_i 在 B 与 G 的最大匹配中也没有连边。所以 B 与 G 不存在完美匹配。



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充分性：(最大流最小割定理法)

构造如下网络流图：

源点 s 与每一个 boy 连边

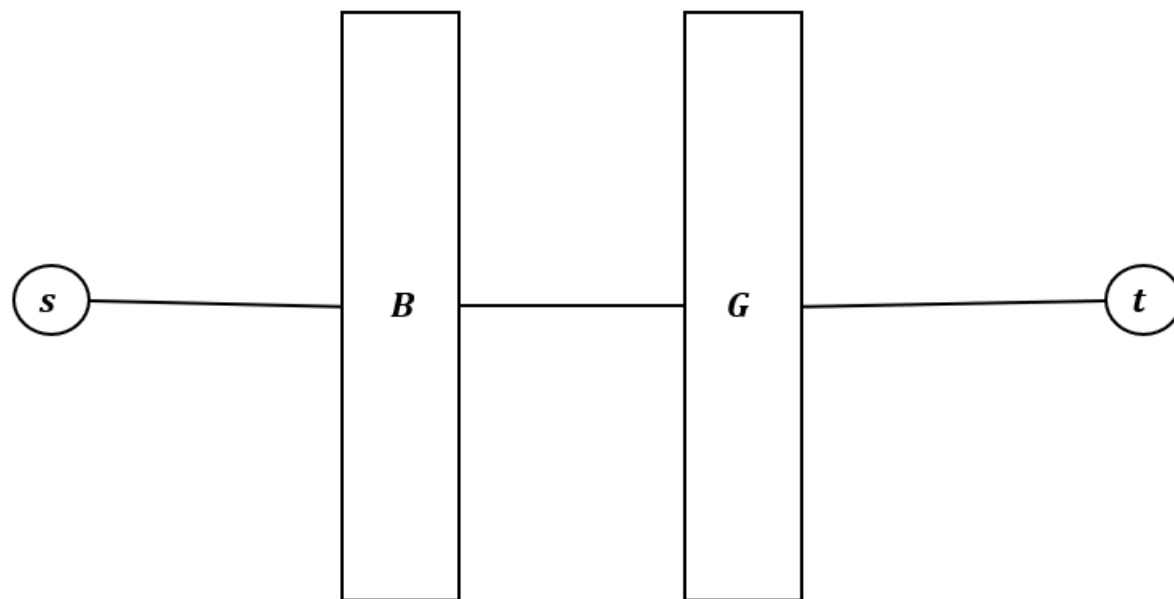
汇点 t 与每一个 girl 连边

B 、 G 间为二分图

边权均为1

考察 s 到 t 的最大流

显然最大流 $\leq |B| = |G| = n$



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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(最大流最小割定理法)

考察该网络流图的任意一个割 $(s + S + T, B/S + G/T + t)$

割边集为 $e_1 \cup e_2 \cup e_3 \cup e_4$

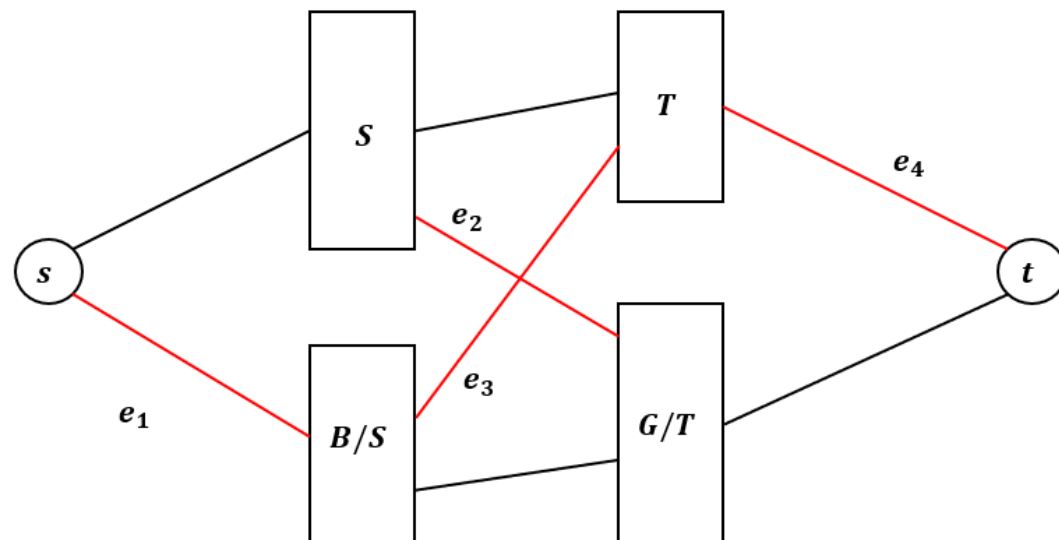
$|e_1| = n - |S|, |e_4| = |T|$

当 $|S| \geq |T|$ 时

$|e_2| \geq |S| - |T|, |e_3| \geq 0$

当 $|S| < |T|$ 时

$|e_2| \geq 0, |e_3| \geq |T| - |S|$



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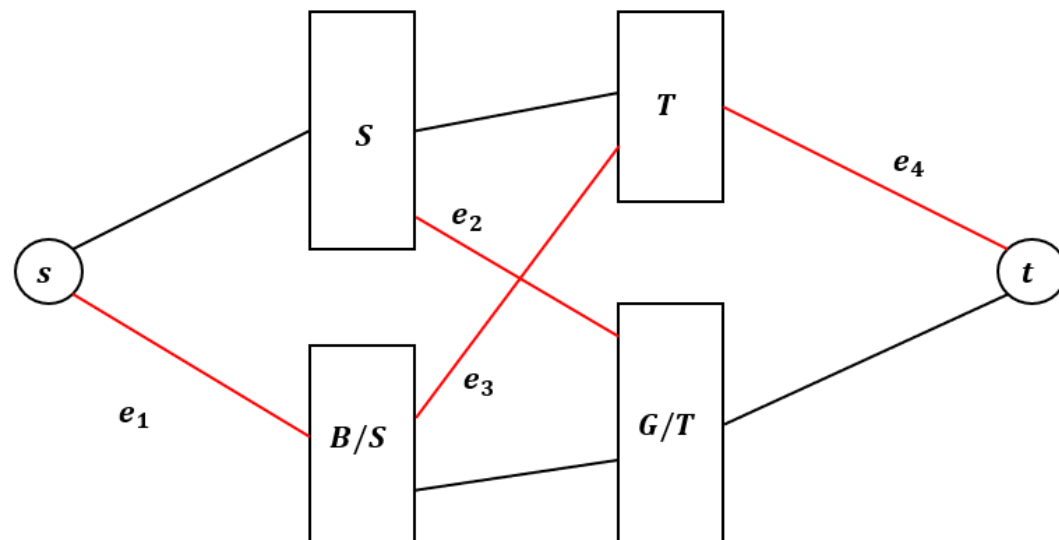
割大小 $cut = |e_1| + |e_2| + |e_3| + |e_4|$

当 $|S| \geq |T|$ 时

$$cut \geq n - |S| + (|S| - |T|) + |T| = n$$

当 $|S| < |T|$ 时

$$cut \geq n - |S| + (|T| - |S|) + |T| = n - 2(|T| - |S|) > n$$



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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(最大流最小割定理法)

考察该网络流图的任意一个割 $(s + S + T, B/S + G/T + t)$

对该网络流图的任意一个割

均满足割大小 $\geq n$

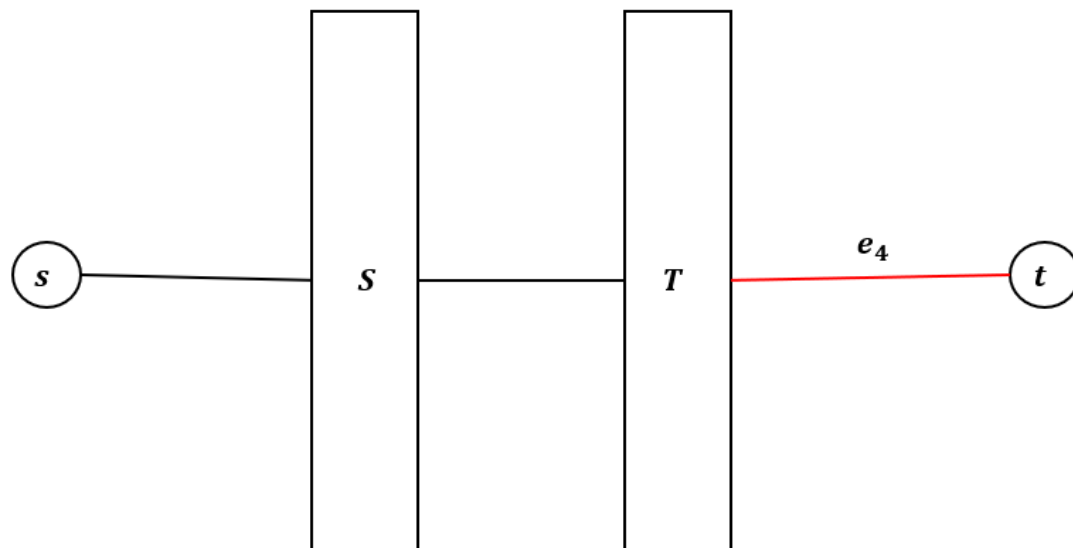
大小为 n 的割显然存在

当 $S = B$ 、 $T = G$ ，割边为 e_4

所以最小割为 n

最大流也为 n

完美匹配一定存在



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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(归纳法)

当 $n = 1$ 时，显然成立

假设当 $n = k$ 时结论成立，即当 $|B| = |G| = k$ ，且对 B 的任意子集 S ，与 S 相连的 G 的子集 T 满足 $|T| \geq |S|$ 时，存在 B 到 G 的完美匹配

当 $n = k + 1$ 时，即当 $|B| = |G| = k + 1$ ，且对 B 的任意子集 S ，与 S 相连的 G 的子集 T 满足 $|T| \geq |S|$ 时，下证存在 B 到 G 的完美匹配

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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

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对 boy b_i ，定义 $N(b_i)$ 为与 b_i 相连的 girl 集合

同理对 girl g_i ， $N(g_i)$ 为与 g_i 相连的 boy 集合

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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(归纳法)

考察连接boy数最小的girl g_1 ，即 $|N(g_1)|$ 最小

若 $|N(g_1)| = 1$

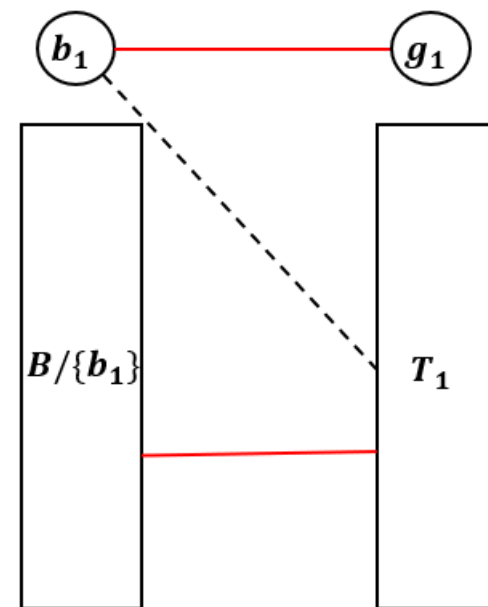
设唯一与 g_1 相连的boy为 b_1

则对 B 的子集 $B/\{b_1\}$ ，与 $B/\{b_1\}$ 相连的girl集合为 T_1 ，有 $|T_1| \geq |B/\{b_1\}| = n$

由于 $N(g_1) = \{b_1\}$ ，所以 $T_1 = G/\{g_1\}$

由归纳假设知，存在 $B/\{b_1\}$ 到 T_1 的完美匹配

P_1 ，则 $P_1 \cup \{(b_1, g_1)\}$ 构成 B 到 G 的完美匹配



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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(归纳法)

考察连接boy数最小的girl g_1 ，即 $|N(g_1)|$ 最小

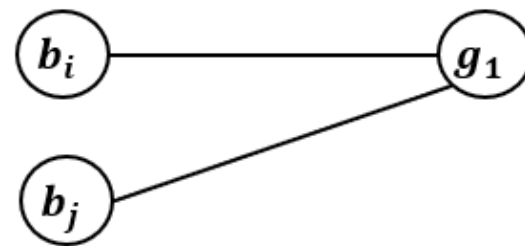
若 $|N(g_1)| \geq 2$

不妨设 $N(g_1) = \{b_1, b_2, \dots, b_{|N(g_1)|}\}$

则 $|N(b_1)|, |N(b_2)|, \dots, |N(b_{|N(g_1)|})|$ 中最多只存在1个为1

否则， $\exists b_i, b_j \in N(g_1)$ ， $N(b_i) = N(b_j) = \{g_1\}$

则与集合 $\{b_i, b_j\}$ 相连的girl仅有 g_1 一人，不满足条件



7.30

Hall's theorem. Returning to the matchmaking scenario of Section 7.3, suppose we have a bipartite graph with boys on the left and an equal number of girls on the right. Hall's theorem says that there is a perfect matching if and only if the following condition holds: any subset S of boys is connected to at least $|S|$ girls.

Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(归纳法)

考察连接boy数最小的girl g_1 ，即 $|N(g_1)|$ 最小

若 $|N(g_1)| \geq 2$

不妨设 $N(g_1) = \{b_1, b_2, \dots, b_{|N(g_1)|}\}$

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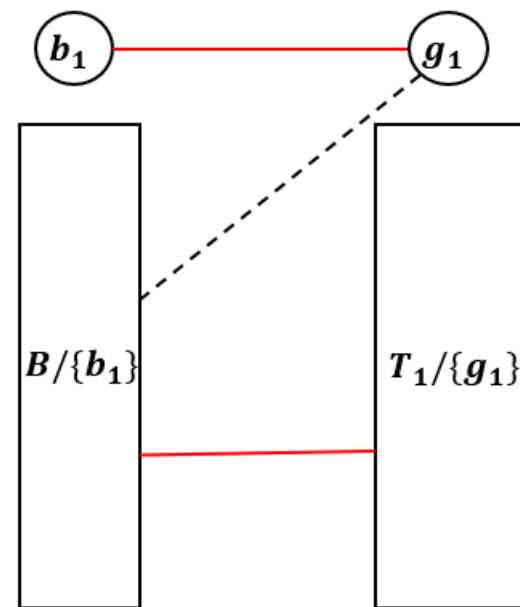
不妨设 $|N(b_1)| = 1$

则对 B 的子集 $B/\{b_1\}$ 相连的girl集合为 $T_1 = G$

则 $|T_1/\{g_1\}| = n$ ，且 $B/\{b_1\}$ 同样与 $T_1/\{g_1\}$ 相连

由归纳假设知，存在 $B/\{b_1\}$ 到 $T_1/\{g_1\}$ 的完美匹

配 P_1 ，则 $P_1 \cup \{(b_1, g_1)\}$ 构成 B 到 G 的完美匹配



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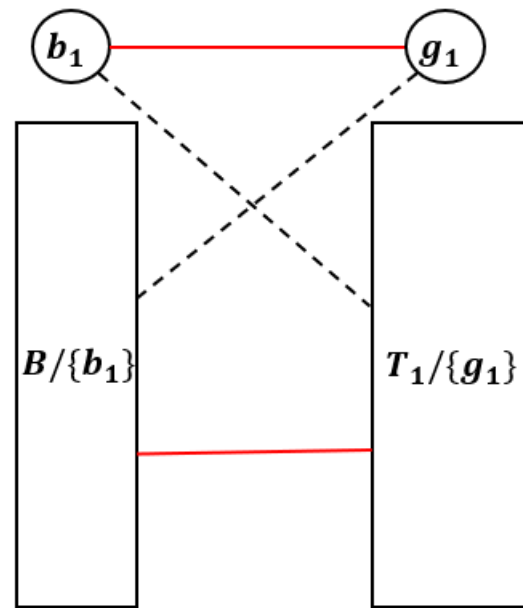
若 $|N(b_1)|, |N(b_2)|, \dots, |N(b_{|N(g_1)|})| \geq 2$

则对 B 的子集 $B/\{b_1\}$ 相连的girl集合为 $T_1 = G$ ，否则存在 g_i 只与 b_1 相连， $|N(g_i)| = 1$ ，与 $|N\{g_1\}|$ 最小矛盾

则 $|T_1/\{g_1\}| = n$ ，且 $B/\{b_1\}$ 同样与 $T_1/\{g_1\}$ 相连

由归纳假设知，存在 $B/\{b_1\}$ 到 $T_1/\{g_1\}$ 的完美匹配 P_1 ，

则 $P_1 \cup \{(b_1, g_1)\}$ 构成 B 到 G 的完美匹配



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Prove this theorem. (Hint: The max-flow min-cut theorem should be helpful.)

充分性：(归纳法)

考察连接boy数最小的girl g_1 ，即 $|N(g_1)|$ 最小

对 $N(g_1)$ 的所有可能情况，均证明存在从 B 到 G 的完美匹配

证明当 $n = k + 1$ ，即 $|B| = |G| = k + 1$ ，且对 B 的任意子集 S ，与 S 相连的 G 的子集 T 满足 $|T| \geq |S|$ 时，存在 B 到 G 的完美匹配

由归纳原理可知，对任意大小的集合 B 和 G ，当与 B 的任意子集 S 相连的 G 的子集 T 满足 $|T| \geq |S|$ 时，存在 B 到 G 的完美匹配

得证

习题七

9.2 Devise a backtracking algorithm for the RUDRATA PATH problem from a fixed vertex s . To fully specify such an algorithm you must define:

- (a) What is a subproblem?
- (b) How to choose a subproblem.
- (c) How to expand a subproblem.

Argue briefly why your choices are reasonable.

回溯算法的过程：

Start with some problem P_0

Let $\mathcal{S} = \{P_0\}$, the set of active subproblems

Repeat while \mathcal{S} is nonempty:

choose a subproblem $P \in \mathcal{S}$ and remove it from \mathcal{S}

expand it into smaller subproblems P_1, P_2, \dots, P_k

For each P_i :

If test(P_i) succeeds: halt and announce this solution

If test(P_i) fails: discard P_i

Otherwise: add P_i to \mathcal{S}

Announce that there is no solution

9.2

给定 $G = (V, E)$ 和源点 s ，输出一条从 s 开始长为 $|V|$ 的 *RUDRATA PATH*

(a) 定义子问题： $P = \{s, v_1, v_2, \dots, v_t\}$ ，表示路径 $s \rightarrow v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_t$ 且该路径为一条合法的 *RUDRATA PATH*， $P_0 = \{s\}$

(b) 选择子问题：选择 $P = \operatorname{argmax}_{P \in S} |P|$ ，减少 S 中储存的子问题数量，有利于算法提前终止

(c) 扩展子问题：对选定的子问题 P ，取路径的终点 v_t ， $\forall v_i \in V$ ， $(v_t, v_i) \in E$ ，得到新的子问题 $P_i = \{s, \dots, v_t, v_i\}$

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9.2 Devise a backtracking algorithm for the RUDRATA PATH problem from a fixed vertex s . To fully specify such an algorithm you must define:

- (a) What is a subproblem?
- (b) How to choose a subproblem.
- (c) How to expand a subproblem.

Argue briefly why your choices are reasonable.

对每一个新的子问题 $P_i = \{s, \dots, v_t, v_i\}$

1、若 $|P_i| = |V|$, 得到答案

2、若 $v_i \in \{s, \dots, v_t\}$, 丢弃子问题

3、若 $v_i \notin \{s, \dots, v_t\}$, $S = S \cup \{P_i\}$

9.7

In the MULTIWAY CUT problem, the input is an undirected graph $G = (V, E)$ and a set of terminal nodes $s_1, s_2, \dots, s_k \in V$. The goal is to find the minimum set of edges in E whose removal leaves all terminals in different components.

- (a) Show that this problem can be solved exactly in polynomial time when $k = 2$.
- (b) Give an approximation algorithm with ratio at most 2 for the case $k = 3$.
- (c) Design a local search algorithm for multiway cut.

(a) $k = 2$, 求 s_1 和 s_2 两点的最小割问题, 用最大流算法求解
 $Edmond - Karp$ 算法复杂度 $O(|V| \cdot |E|)$

(b) $k = 3$

分别求 s_1 和 s_2 的最小割 Cut_1 、 s_2 和 s_3 的最小割 Cut_2 以及 s_1 和 s_3 的最小割 Cut_3 , 显然 Cut_1 、 Cut_2 和 Cut_3 中只需要保留2个割即可

不妨设 $Cut_1 \leq Cut_2 \leq Cut_3$, 近似解 $\mathcal{A} = Cut_1 + Cut_2$

对最优解 Opt , 显然有 $Opt \geq Cut_3 \geq Cut_2 \geq Cut_1$

所以近似比 $\alpha_{\mathcal{A}} = \max \frac{\mathcal{A}}{Opt} \leq 2$

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```

let  $s$  be any initial solution
while there is some solution  $s'$  in the neighborhood of  $s$ 
    for which  $\text{cost}(s') < \text{cost}(s)$ : replace  $s$  by  $s'$ 
return  $s$ 

```

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(c) $\forall v \in V$, 设 $Label(v)$ 为点 v 的标签

初始时, $s_i \in \{s_1, s_2, \dots, s_k\}$, $Label(s_i) = l_i$, $v \notin \{s_1, s_2, \dots, s_k\}$, $Label(v) = 0$

以 s_1 为起点进行 *BFS*, 遍历到节点 v , 若 $Label(v) = 0$, 则修改 $Label(v) = l_1$, 并继续 *BFS*; 若 $Label(v) \neq 0$, 则回溯。

对 s_2, \dots, s_k 重复上述过程直到所有点 $Label(v) \neq 0$

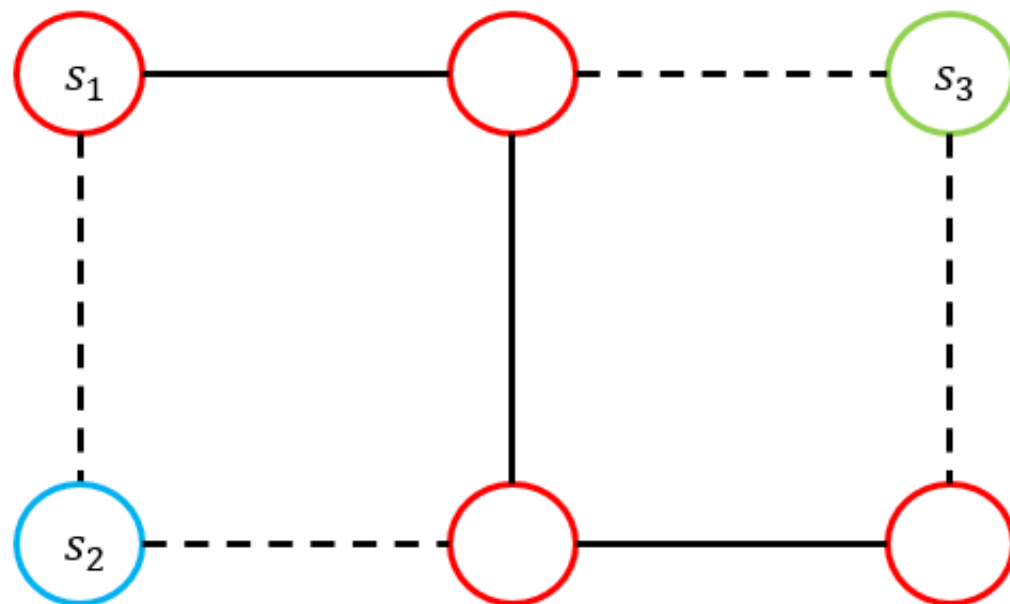
$S = \{e(v_i, v_j) | e(v_i, v_j) \in E, Label(v_i) \neq Label(v_j)\}$ 为初始解

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(c) 取 $\forall e(v_i, v_j) \in S$, 分别计算修改 $Label(v_i) = Label(v_j)$ 和 $Label(v_j) = Label(v_i)$ 时新的割边边集 S_1 和 S_2

若 $|S| > |S_1|$, $S = S_1$; 若 $|S| > |S_2|$, $S = S_2$

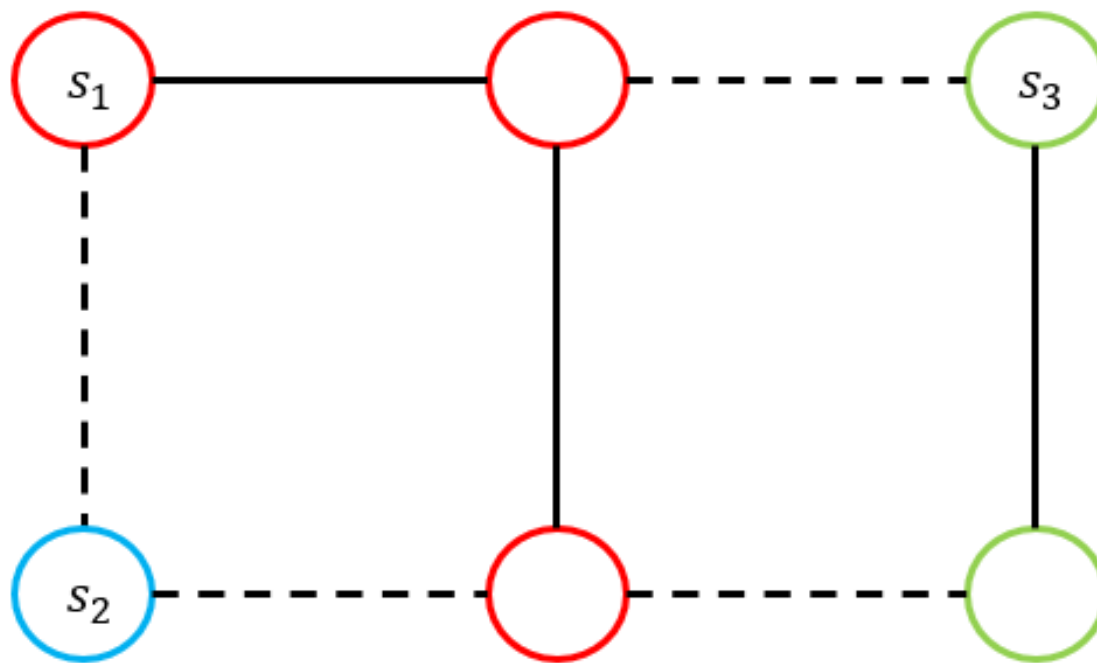
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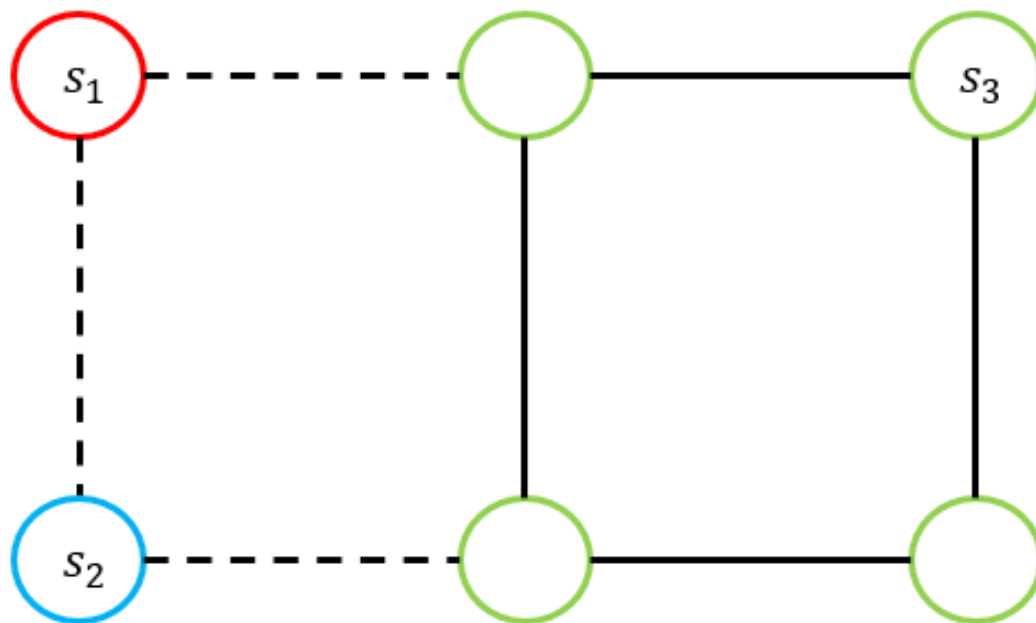
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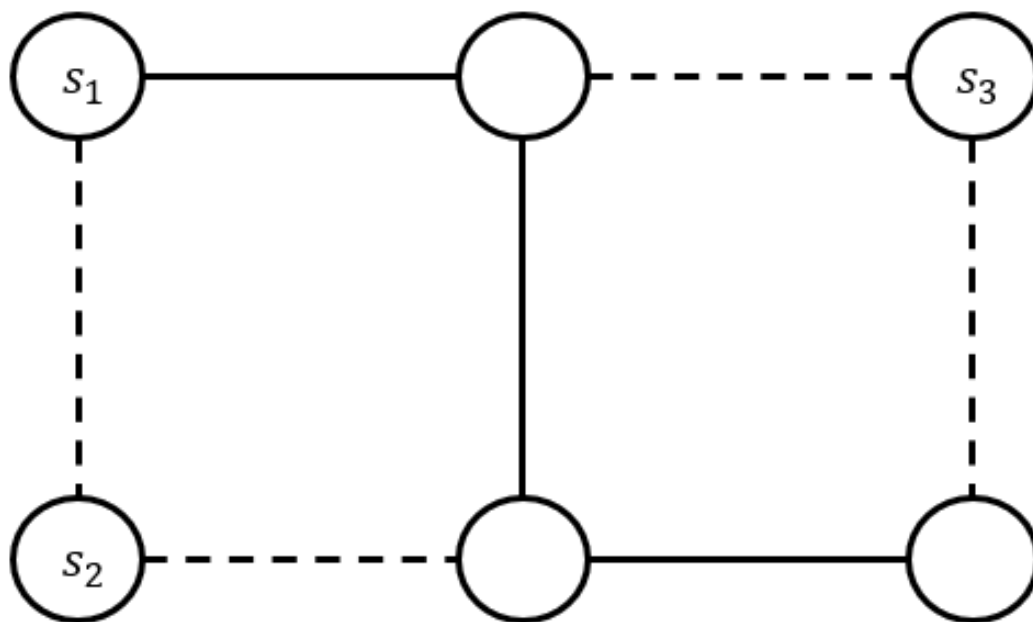
(c) 取 $\forall e_1, e_2 \in S$, 对 $E/S \cup \{e_1, e_2\}$, 若 s_1, \dots, s_k 之间的最小割 ≤ 1 且包含公共边 e_3 时, $S = S/\{e_1, e_2\} \cup \{e_3\}$
直到 S 不再改变为止

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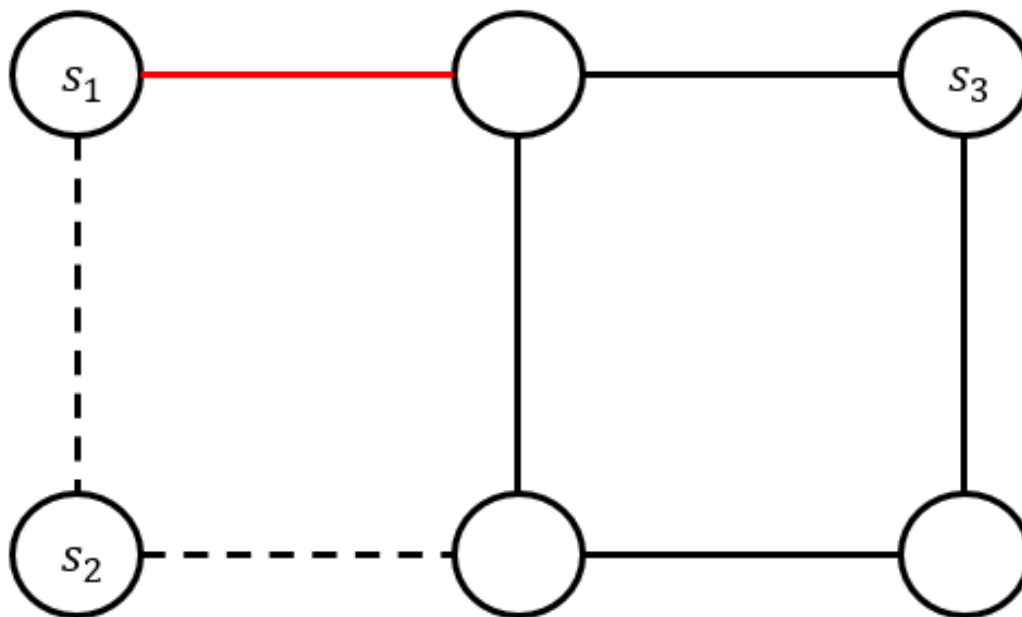


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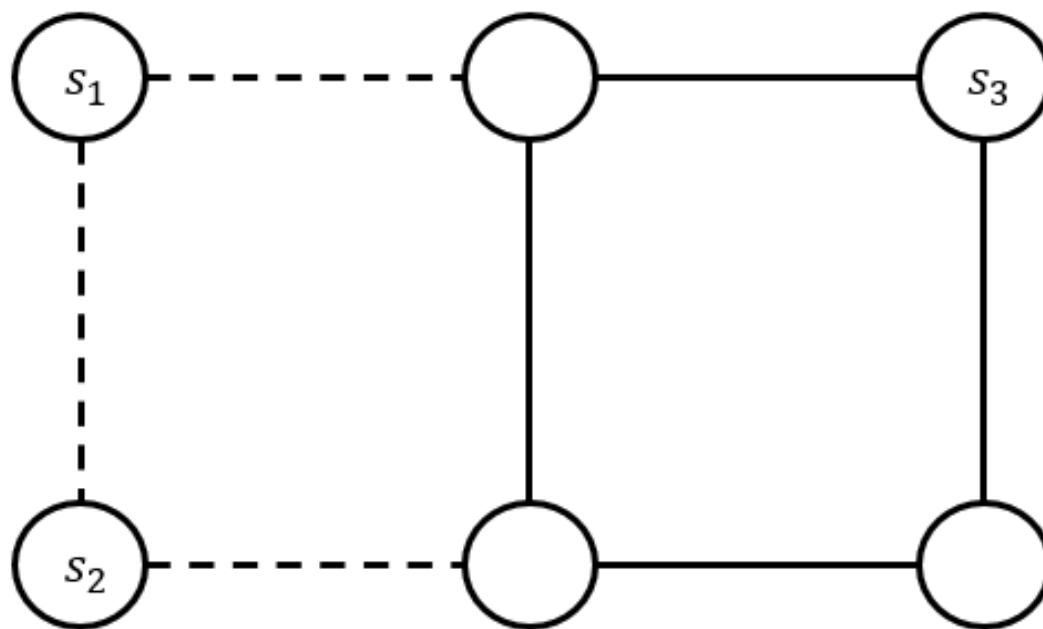


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- (c) Design a local search algorithm for multiway cut.

(c)



9.9

In the MAXIMUM CUT problem we are given an undirected graph $G = (V, E)$ with a weight $w(e)$ on each edge, and we wish to separate the vertices into two sets S and $V - S$ so that the total weight of the edges between the two sets is as *large* as possible.

For each $S \subseteq V$ define $w(S)$ to be the sum of all $w(e)$ over all edges $\{u, v\}$ such that $|S \cap \{u, v\}| = 1$. Obviously, MAX CUT is about maximizing $w(S)$ over all subsets of V .

Consider the following local search algorithm for MAX CUT:

```
start with any  $S \subseteq V$ 
while there is a subset  $S' \subseteq V$  such that
   $||S'| - |S|| = 1$  and  $w(S') > w(S)$  do:
  set  $S = S'$ 
```

- (a) Show that this is an approximation algorithm for MAX CUT with ratio 2.
- (b) But is it a polynomial-time algorithm?

9.9

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(a) Show that this is an approximation algorithm for MAX CUT with ratio 2.

(b) But is it a polynomial-time algorithm?

(a) 假设该算法得到的解为 $(S_1, V/S_1)$, 最优解为 $(S_o, V/S_o)$

$$S_1 \cap S_o = A, S_1 \cap (V/S_o) = B,$$

$$(V/S_1) \cap S_o = C, (V/S_1) \cap (V/S_o) = D$$

$$A \cup B = S_1, A \cup C = S_o$$

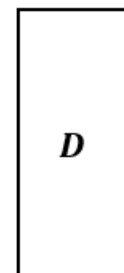
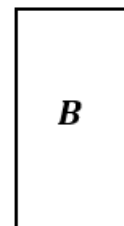
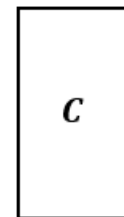
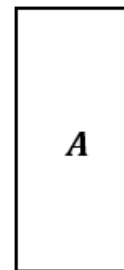
$$\text{设 } w(A, B) = \sum_{e(u,v) \in E, u \in A, v \in B} w(e)$$

由于 S_1 为局部搜索算法所得解, 满足

$$\forall v \in S_1, w(\{v\}, V/S_1) \geq w(\{v\}, S_1/\{v\})$$

$$w(A, B) = \sum_{v \in A} w(\{v\}, B) \leq \sum_{v \in A} w(\{v\}, S_1/\{v\})$$

$$\leq \sum_{v \in A} w(\{v\}, C \cup D) = w(A, C \cup D)$$



9.9

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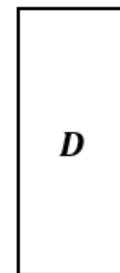
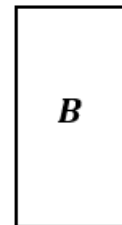
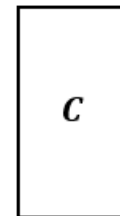
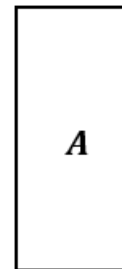
$$(a) w(A, B) \leq w(A, C \cup D)$$

$$w(C, D) \leq w(A \cup B, C)$$

$$\begin{aligned}
 \text{最优解 } w(S_o) &= w(A, B) + w(A, D) + w(B, C) + w(C, D) \\
 &\leq w(A, C \cup D) + w(A \cup B, D) + w(B, C \cup D) + w(A \cup B, C) \\
 &= 2 \cdot w(A \cup B, C \cup D) = 2w(S)
 \end{aligned}$$

$$\text{即 } w(S_o) \leq 2w(S)$$

$$\text{所以近似比 } \alpha_S = \min \frac{S}{S_o} = \frac{1}{2}$$



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(a) Show that this is an approximation algorithm for MAX CUT with ratio 2.

(b) But is it a polynomial-time algorithm?

(b) 每一轮最多考虑 $|V|$ 个点是否改变位置

每一轮如果 S 更新，则割边数量至少+1，当 S 不再更新时算法结束，因此最多更新 $|E|$ 轮

从一个确定的 S 开始时，算法复杂度为 $O(|V| \cdot |E|)$