

# Lecture 2

## Fast Cut algo

review **Contract Algorithm** for Min-Cut problem

```
1 | Contract Algo:
2 |   Pick an edge uniformly at random;
3 |   Merge the endpoints of this edge;
4 |   Remove self-loops;
5 |   Repeat steps in line 2-4 until only two vertices left;
6 |   The remaining edges form a candidata cut;
```

time complexity:  $O(n^2)$

successful probability:  $\Omega(\frac{1}{n^2})$

improvement:

```
1 | Fast Cut algorithm: ref Randomized Algo 10.2
2 | Input: multigraph G(V,E)
3 | Output: cut C
4 |   if n <= 6:
5 |       compute min-cut by brute-force enumeration
6 |   else:
7 |       t = [1+n/sqrt2]
8 |       Using Contract algo, perform two independent contract sequences to obtain graphs H1 and H2
9 |       ...each with t vertices
10 |      Recursively compute min-cuts in each of H1,H2
11 |      return the smaller of the two min-cuts
12 |
```

Time complexity:

$$T(n) = 2T\left(\frac{n}{\sqrt{2}}\right) + O(n^2)$$

$$T(n) = O(n^2 \log n)$$

Successful probability:

the origin size n problem is reduced to two subproblem size  $\frac{n}{\sqrt{2}}$ , considering the contract procedure, the probability that the result of subproblem is exactly the result of origin problem is

$$(1 - \frac{2}{n})(1 - \frac{2}{n-1}) \dots (1 - \frac{2}{n/\sqrt{2}}) = \frac{(\frac{n}{\sqrt{2}} - 1)(\frac{n}{\sqrt{2}} - 2)}{n(n-1)} \geq \frac{1}{2}$$

denote the successful probability of origin problem with size  $n$  by  $P(k+1)$ , subproblem with size  $\frac{n}{\sqrt{2}}$  by  $P(k)$ , then we have

$$P(k+1) = 1 - (1 - \frac{1}{2}P(k))^2$$

so we get

$$P(k+1) = P(k) - \frac{1}{4}P(k)^2$$

perform a change of variable  $P(k) = \frac{4}{q(k)+1}$ , yields the following simplification:

$$q(k+1) = q(k) + 1 + \frac{1}{q(k)}$$

recursively apply the equation to the righthand side

$$q(k) = q(1) + k - 1 + \sum_{1 \leq i \leq k-1} \frac{1}{q(i)} \geq k - 1$$

by using  $q(k) \geq k - 1$ , we have

$$q(k) \leq q(1) + k - 1 + \sum_{1 \leq i \leq k-1} \frac{1}{i} \leq q(1) + k - 1 + \log k$$

combine the upper bound and lower bound

$$q(k) = \Theta(k)$$

$$P(k) = \Theta(\frac{1}{k})$$

observe that  $k = \log n$ , we can draw the conclusion

$$Pr(n) = \Theta\left(\frac{1}{\log n}\right)$$

## Las Vegas VS. Monte Carlo

- Las Vegas: random running time (quick sort)
- Monte Carlo: randomized quality of solution (randomized min cut)

## Complexity Class

only consider decision problem in this chapter

### P and NP

**Definition(P):**

$$L \in P \iff \exists \text{Polynomial time algorithm } A \text{ s.t. } \forall x \in \Sigma^*, \begin{cases} x \in L \Rightarrow A(x) \text{ accepts} \\ x \notin L \Rightarrow A(x) \text{ rejects} \end{cases}$$

**Definition(NP):**

$$L \in NP \iff \exists \text{Polynomial time algorithm } A \text{ s.t. } \forall x \in \Sigma^*, \begin{cases} x \in L \Rightarrow \exists y, |y| = \text{poly}|x|, A(x, y) \text{ accepts} \\ x \notin L \Rightarrow \forall y, |y| = \text{poly}|x|, A(x, y) \text{ rejects} \end{cases}$$

**NP-hard problem (informal definition):** A is NP-hard  $\Leftrightarrow$  if A is polynomial time solvable, all problems in NP are polynomial time solvable

**NP-complete:** both NP-hard and in NP

famous NP-complete problems: 3-SAT, Vertex cover, Set cover, Clique, Independent set, integer programming...

### RP CoRP

**Definition(RP randomized poly time):**

$$L \in RP \iff \exists \text{randomized algorithm } A \text{ running in worst-case polynomial times } t. \forall x \in \Sigma^*, \begin{cases} x \in L \Rightarrow Pr(A(x) \text{ accepts}) \geq \frac{1}{2} \\ x \notin L \Rightarrow Pr(A(x) \text{ accepts}) = 0 \end{cases}$$

**Definition(RP):**

$$L \in co - RP \iff$$

$\exists$  randomized algorithm A running in worst-case polynomial times  $t$ .  $\forall x \in$

$$\Sigma^*, \begin{cases} x \in L \Rightarrow \Pr(A(x) \text{ accepts}) = 1 \\ x \notin L \Rightarrow \Pr(A(x) \text{ accepts}) \leq \frac{1}{2} \end{cases}$$

RP and Co-RP are defined with one side-error, which means that, for  $L \in RP$  and randomized algorithm A, if A say " $x \in L$ ", it is definitely correct, but if A say not, it could be wrong.

**Theorem:**

$$(1) RP \subseteq NP$$

$$(2) coRP \subseteq coNP$$

**Prove (1):**

consider randomized algorithm A, need to notice that if we know how A produces random number, then we can regard A as a deterministic algorithm.

denote the random string of A is r, for any x,  $|r| \leq \text{poly}|x|$ , construct algorithm  $B(x, r) = A(x)$

## BPP, PP, ZPP

These three complexity classes deal with *error*

**Definition(BPP bounded error prob poly time):**

$$L \in BPP \iff$$

$\exists$  randomized algorithm A running in worst-case polynomial times  $t$ .  $\forall x \in$

$$\Sigma^*, \begin{cases} x \in L \Rightarrow \Pr(A(x) \text{ accepts}) \geq \frac{3}{4} \\ x \notin L \Rightarrow \Pr(A(x) \text{ accepts}) \leq \frac{1}{4} \end{cases}$$

**Definition(PP prob poly time):**

$$L \in BPP \iff$$

$\exists$  randomized algorithm A running in worst-case polynomial times  $t$ .  $\forall x \in$

$$\Sigma^*, \begin{cases} x \in L \Rightarrow \Pr(A(x) \text{ accepts}) > \frac{1}{2} \\ x \notin L \Rightarrow \Pr(A(x) \text{ accepts}) < \frac{1}{2} \end{cases}$$

**Definition(ZPP Zero-error prob poly time):**

the class of language that have **Las Vegas** algorithm running in **expected** polynomial time

**Theorem:**

1.  $RP \subseteq BPP (\subseteq PP)$
2.  $NP \subseteq PP$
3.  $ZPP = RP \cap coRP$

**Prove:**

(1) repeat

(2) NP: algorithm A

PP: algorithm B: randomly choose y as witness,  $|y| = \text{poly}|x|$

if  $A(x,y)$  accepts, B accept

if  $A(x,y)$  rejects, B has probability  $1/2$  to accept,  $1/2$  to reject

(3) ZPP algo A; RP, coRP algo B1, B2

" $\subseteq$ " by using "cut off"

given  $|x|^n$  as time limit

B1 & B2: execute A(x) in  $|x|^n$  time, if A accepts \ rejects, B accepts \ rejects, else if A does not stop, B1 rejects, B2 accepts.

Markov inequality:

$$Pr(X \geq c) \leq \frac{E(x)}{c}$$

guarantees the probability bound.

" $\supseteq$ "

```
1 | ZPP algorithm A:
2 | Input: x
3 |     execute B1(x), if B1 accepts, A accepts
4 |     execute B2(x), if B2 rejects, B rejects
5 |     repeat line 3-4
```

repeat 3-4 one time has probability  $3/4$  to stop, which ensures the expected running time is poly.

## Relations

$$P \subseteq RP \subseteq_{BPP}^{NP} PP \subseteq PSPACE$$