

TODAY: Fixed-parameter algorithms

- vertex cover
- fixed-parameter tractability
- kernelization
- connection to approximation

↘  
an alternative  
to approx.  
algorithms ~  
dealing with  
NP-hardness

Pick any 2: (cf. friends, sleep, work)

- ① hard problems
  - ② fast (poly.-time) algorithms
  - ③ exact solutions
- approx. algs. [L17] → FPT [TODAY]

Idea: aim for exact algorithm, [Downey & Fellows 1997]  
but isolate exponential term to a parameter  
⇒ get fast solution for instances  
with small parameter value

- hope parameter is small in practice

Parameter = nonnegative integer  $k(x)$  ↘ problem input

- often a "natural" parameter ( $k$  in input)
- not necessarily efficiently computable (e.g. OPT)

Parameterized problem = problem + parameter  
"problem w.r.t. parameter"  
(potentially many interesting parameterizations)

Goal: polynomial in problem size  $n$ ,  
exponential in parameter  $k$

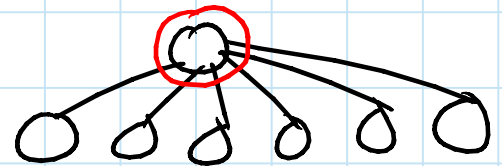
Example:  $k$ -Vertex Cover (NP-hard)

Given: graph  $G=(V,E)$ , nonnegative integer  $k$

Q: is there a set  $S$  of  $\leq k$  vertices  
that "covers" all edges:  $\forall e \in E \exists v \in S \cap e$

Parameter:  $k$

Note: can have  $k \ll |V|$ :



Brute-force solution: (BAD)

- try all  $\binom{V}{k} + \binom{V}{k-1} + \dots + \binom{V}{0}$  sets of  $\leq k$  vxs.

can skip - bigger is better

- test coverage in  $O(m)$  time ( $m = \#edges$ )

$\Rightarrow O(V^k E)$  time

- polynomial for fixed  $k$

- but not same polynomial - e.g. not  $O(V^{100})$

- inefficient in most cases

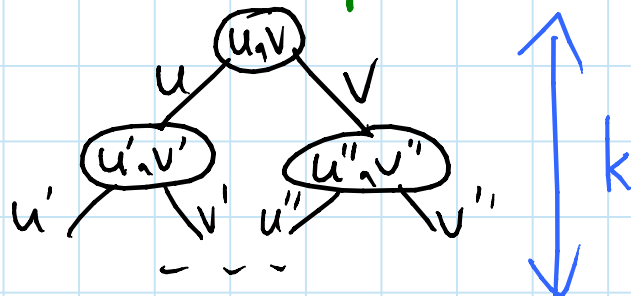
$\Rightarrow$  define  $n^{f(k)}$  to be BAD

$\hookrightarrow$  here  $n = |V| + |E|$

## general technique

### Bounded search-tree algorithm: (GOOD)

- pick arbitrary edge  $e=(u,v)$
- know that either  $u \in S$  or  $v \in S$  (or both) but don't know which
- guess: try both possibilities
  - ① add  $u$  to  $S$ 
    - delete  $u$  & incident edges from  $G$
    - recurse with  $k'=k-1$
  - ② ditto with  $v$  instead of  $u$ 
    - return OR of two outcomes
- like guessing in dynamic programming, but memoization doesn't help here
- recursion tree:



- at leaf ( $k=0$ ):
  - return  $|E| \stackrel{?}{=} 0$
- $O(V)$  time to delete  $u$  or  $v$
- $\Rightarrow O(2^k \cdot V)$  time
  - $O(V)$  for fixed  $k$
  - degree of polynomial independent of  $k$
  - also polynomial for  $k = O(\lg V)$
  - practical for e.g.  $k \leq 32$
  - define  $f(k) \cdot n^{O(1)}$  to be GOOD

FPT: parameterized problem is fixed-parameter tractable (FPT) if there is an algorithm with running time  $\leq f(k)n^{O(1)}$

$f: \mathbb{N} \rightarrow \mathbb{N}$  (nonneg.) ← parameter → indep. of  $k$  &  $n$

Question: why  $f(k) \cdot n^{O(1)}$  not  $f(k) + n^{O(1)}$ ?

Theorem:  $\exists f(k) \cdot n^c$  algorithm  $\Leftrightarrow \exists f'(k) + n^{c'}$  algorithm

Proof: ( $\Leftarrow$ ) trivial (assuming  $f'(k) \geq 1$  &  $n^{c'} \geq 1$ )

( $\Rightarrow$ ) if  $n \leq f(k)$  then  $f(k) \cdot n^c \leq f(k)^{c+1}$

if  $f(k) \leq n$  then  $f(k) \cdot n^c \leq n^{c+1}$

so  $f(k) \cdot n^c \leq \max \{ f(k)^{c+1}, n^{c+1} \}$

$$\leq \underbrace{f(k)^{c+1}}_{f'(k)} + \underbrace{n^{c+1}}_{n^{c'}}.$$

□

OR:  $xy \leq x^2 + y^2 \rightarrow f'(k) = f(k)^2$  &  $c' = 2c$

Example:  $O(2^k n) \leq O(4^k + n^2)$

Kernelization: a simplifying self-reduction  
polynomial-time algorithm converting  
input  $(x, k)$  into small equivalent input  $(x', k')$   
 $|x'| \leq f(k)$   $\leftarrow$   $\rightarrow$   $\text{answer}(x) = \text{answer}(x')$

Theorem: FPT  $\Leftrightarrow \exists$  kernelization

Proof:  $(\Leftarrow)$  kernelize  $\Rightarrow n' \leq f(k)$   
run any finite  $g(n')$  algorithm  
 $\Rightarrow n^{O(1)} + g(f(k))$  time


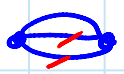

$(\Rightarrow)$  let  $A$  be an  $f(k) \cdot n^c$  algorithm  
if  $n \leq f(k)$  then already kernelized  
if  $f(k) \leq n$ :  
- run  $A \rightarrow f(k) \cdot n^c \leq n^{c+1}$  time  $\checkmark$   
- output  $O(1)$ -size YES/NO instance  
as appropriate (to kernelize)

assuming  
 $k$  is known

if  $k$  is unknown: run  $A$  for  $n^{c+1}$  time  
& if not done, know already kernelized  $\square$

So (exponential) kernel exists. Recent work aims to  
find polynomial (even linear) kernels when possible.

## Polynomial kernel for $k$ -vertex cover:

- make graph simple:
  - remove loops  & multi-edges 
- any vertex of degree  $> k$  must be in cover (else need  $> k$  vertices to cover inc. edges)
- remove such vertices (& incident edges) one at a time, decreasing  $k$  accordingly
  - $\Rightarrow$  remaining graph has max. degree  $\leq k$
  - $\Rightarrow$  each remaining cover vertex covers  $\leq k$  edges
  - $\Rightarrow$  if #remaining edges  $> k^2$ , answer is No: ,  $\emptyset$
- else  $|E'| \leq k^2$
- remove isolated vertices
  - $\Rightarrow |V'| \leq 2k^2$
  - $\Rightarrow$  reduced to instance  $(V', E')$  of size  $O(k^2)$
- running time:  $O(VE)$  quadratic kernel obvious,  
 $O(V+E)$  with more work
- if we now apply:
  - brute-force solution  $\Rightarrow O(V+E + (2k^2)^k k^2)$   
 $= O(V+E + 2^k k^{2k+2})$  time
  - bounded search-tree solution  
 $\Rightarrow O(V+E + 2^k k^2)$  time

Best algorithm to date:  $O(kV + 1.274^k)$   
[Chen, Kanj, Xia - TCS 2010]

## Connection to approximation algorithms:

- take optimization problem, integral OPT
- consider associated decision problem:  $\text{OPT} \leq k$ ?
- parameterize by  $k$

Theorem: optimization problem has EPTAS

efficient PTAS:  $f(1/\epsilon) \cdot n^{O(1)}$

e.g. Approx-Partition [L17]

$\Rightarrow$  decision problem is FPT

Proof: (like FPTAS  $\leftrightarrow$  pseudopoly. alg.)

- say maximization problem ( $\& \leq k$  decision)

- run EPTAS with  $\epsilon = 1/2k$  in  $f(2k) \cdot n^{O(1)}$

- relative error  $\leq 1/2k < 1/k$

$\Rightarrow$  absolute error  $< 1$  if  $\text{OPT} \leq k$

- so if we find solution with value  $\leq k$

then  $\text{OPT} \leq (1 + 1/2k) \cdot k \leq k + 1/2$

integral  $\Rightarrow \text{OPT} \leq k \Rightarrow \text{YES}$ .

- else  $\text{OPT} > k$

□

Also:  $=, \leq, \geq$  decision problems are equivalent w.r.t. FPT

~ Can use this relation to prove EPTASs don't exist in some cases

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