Parameterized Algorithms

Lecture 4: Kernelization May 29, 2020

Max-Planck Institute for Informatics, Germany.

KERNELIZATION















Is there an assignment satisfying at least k clauses?



Is there an assignment satisfying at least k clauses?

What if k is at most m/2?



Is there an assignment satisfying at least k clauses?

What if k is at most m/2?





Is there an assignment satisfying at least k clauses?

What if k is at most m/2?





Is there an assignment satisfying at least k clauses?

What if k is at most m/2? Say YES.



Is there an assignment satisfying at least k clauses?

What if k is at most m/2?

Say YES.

k > m/2?





Is there an assignment satisfying at least k clauses?

What if k is at most m/2?

Say YES.

k > m/2?

The number of clauses is bounded by 2k.



Is there an assignment satisfying at least k clauses?

VARIABLES



We have at most k variables left.







Is there an assignment satisfying at least k clauses?

If we have at most k variables - nothing to do.

If we have at least k variables and we have a matching from Variables — Clauses then we can say YES.





Else, we have at least k variables, but no matching from Variables — Clauses.

HALL'S THEOREM

If, in a bipartite graph with parts A and B, there is no matching from A to B, then there is a subset X of A such that

 $|\mathsf{N}(\mathsf{X})| < |\mathsf{X}|$



HALL'S THEOREM





[inclusion-minimal]





Is there an assignment satisfying at least k clauses?

[inclusion-minimal]





Is there an assignment satisfying at least k clauses?

[inclusion-minimal]









Is there an assignment satisfying at least k clauses?





Is there an assignment satisfying at least k clauses?

We removed an inclusion-minimal violating set.





Is there an assignment satisfying at least k clauses?

Get rid of one vertex...





Is there an assignment satisfying at least k clauses?

Get rid of one vertex...





Is there an assignment satisfying at least k clauses?

Get rid of one vertex...

The rest of it can be matched!







This implies a kernel with at most \mathbf{k} variables and $2\mathbf{k}$ clauses.




Is there a subset of vertices S of size at most k that intersects all the edges?





Is there a subset of vertices S of size at most k that intersects all the edges?



What if a vertex has more than k neighbors?



Is there a subset of vertices S of size at most k that intersects all the edges?



What if a vertex has more than k neighbors?





Is there a subset of vertices S of size at most k that intersects all the edges?



What if a vertex has more than k neighbors?





Is there a subset of vertices S of size at most k that intersects all the edges?



What if a vertex has more than k neighbors?





Is there a subset of vertices S of size at most k that intersects all the edges?



What if a vertex has more than k neighbors? We cannot afford to leave v out of any vertex cover of size at most k.





Is there a subset of vertices S of size at most k that intersects all the edges?



If a vertex has more than k neighbors,





Is there a subset of vertices S of size at most k that intersects all the edges?



If a vertex has more than k neighbors,

delete it from the graph and reduce the budget by one.





Is there a subset of vertices S of size at most k that intersects all the edges?



When we have nothing more to do...





Is there a subset of vertices S of size at most k that intersects all the edges?



When we have nothing more to do...

every vertex has degree at most k.





Is there a subset of vertices S of size at most k that intersects all the edges?



When we have nothing more to do...

every vertex has degree at most k.





Is there a subset of vertices S of size at most k that intersects all the edges?



If the graph has more than k² edges,





Is there a subset of vertices S of size at most k that intersects all the edges?



If the graph has more than k² edges,

reject the instance.





Is there a subset of vertices S of size at most k that intersects all the edges?



Otherwise:



Is there a subset of vertices S of size at most k that intersects all the edges?



Otherwise:

the number of edges is at most k^2 .



Is there a subset of vertices S of size at most k that intersects all the edges?



Otherwise:

the number of edges is at most k^2 .

Vertices?



Is there a subset of vertices S of size at most k that intersects all the edges?



Otherwise:

the number of edges is at most k^2 .

Vertices?

k² edges can be involved in at most 2k² vertices. Throw away isolated vertices.



Is there a subset of vertices S of size at most k that intersects all the edges?



This implies a kernel with at most $2k^2$ vertices and k^2 edges.



Question

Is there a subset of vertices S of size at most k that intersects all the edges?







Is there a subset of vertices S of size at most k that intersects all the edges?



Question



[BUSS KERNELIZATION]



Question

Is there a subset of k arcs that can be reversed to make the tournament acyclic?





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



A tournament has a cycle if, and only if, it has a triangle.















Is there a subset of k arcs that can be reversed to make the tournament acyclic?



A tournament has a cycle if, and only if, it has a triangle.

Delete a vertex if it does not belong to any triangle.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



A tournament has a cycle if, and only if, it has a triangle.

Delete a vertex if it does not belong to any triangle.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



Delete a vertex if it does not belong to any triangle.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



Delete a vertex if it does not belong to any triangle.





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



Delete a vertex if it does not belong to any triangle.




Is there a subset of k arcs that can be reversed to make the tournament acyclic?



What about an edge that participates in more than k triangles?



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



What about an edge that participates in more than k triangles?





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



What about an edge that participates in more than k triangles?



Reverse it and decrease the budget by one.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



At most k arcs in any solution.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



At most k arcs in any solution.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



At most k arcs in any solution.





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



At most k arcs in any solution.

• • • • • • • •

Every vertex is in a triangle, and every arc "sees" at most k triangles.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?





Is there a subset of k arcs that can be reversed to make the tournament acyclic?



After reducing the graph, if there are more than k^2 + 2k vertices,

reject the instance.



Is there a subset of k arcs that can be reversed to make the tournament acyclic?



This implies a kernel with at most $k^2 + 2k$ vertices.

Does U have a subset S of size at most k that intersects every set in F?



Does U have a subset S of size at most k that intersects every set in F?



Does U have a subset S of size at most k that intersects every set in F?



What if there are more than k sets with one element in common?

Does U have a subset S of size at most k that intersects every set in F?



What if there are more than k sets with one element in common?



Does U have a subset S of size at most k that intersects every set in F?



What if there are more than k sets with one element in common, and every set is mutually disjoint otherwise?

Does U have a subset S of size at most k that intersects every set in F?



What if there are more than k sets with one element in common, and every set is mutually disjoint otherwise?





Does U have a subset S of size at most k that intersects every set in F?





Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



{1,2,53,54,55}
{1,2,68,69,67}
{1,2,15,12,11}
{1,2,23,24,29}
{1,2,72,71,70}

Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



If a d-uniform family F has at least $d!(k-1)^d$ sets, then it has a subcollection of at least k sets that:

have a common mutual intersection (a core) are pairwise disjoint otherwise (petals).

Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



Sunflowers can also be computed in polynomial time.

Sunflower Lemma [By the way...]

Does U have a subset S of size at most k that intersects every set in F?



As long as there is a sunflower involving at least k+1 petals, remove it and replace it with its core.

Intuition

Does U have a subset S of size at most k that intersects every set in F?



{1,2,53,54,55}
{1,2,68,69,67}
{1,2,15,12,11}
{1,2,23,24,29}
{1,2,72,71,70}

Intuition

Does U have a subset S of size at most k that intersects every set in F?



{1,2}

Intuition

Does U have a subset S of size at most k that intersects every set in F?



The rule destroys d-uniformity.

What if the core is empty?

Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



The rule destroys d-uniformity. Fix this by iterating over d.

What if the core is empty?

Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



The rule destroys d-uniformity. Fix this by iterating over d.

What if the core is empty? This means we have more than k disjoint sets, so we can reject the instance.

Sunflower Lemma

Does U have a subset S of size at most k that intersects every set in F?



This implies a kernel with at most $d!k^d$ sets, and $d(d!)k^d$ elements.

Feedback Vertex Set

Problem Definition

FEEDBACK VERTEX SETParameter: kInput: An undirected graph G and a positiveinteger k.Question: Does there exists a subset X of sizeat most k such that G - X is acyclic?

X is called feedback-vertex set (fvs) of G.

Problem Definition

FEEDBACK VERTEX SETParameter: kInput: An undirected graph G and a positiveinteger k.Question: Does there exists a subset X of sizeat most k such that G - X is acyclic?

X is called feedback-vertex set (fvs) of G. Goal is to obtain a polynomial kernel for FEEDBACK VERTEX SET.

Reduction.FVS If there is a loop at a vertex v, delete v from the graph and decrease k by one.

Multiplicity of a multiple edge does not influence the set of feasible solutions to the instance (G, k). Reduction.FVS If there is an edge of multiplicity larger than 2, reduce its multiplicity to 2.

Any vertex of degree at most 1 does not participate in any cycle in G, so it can be deleted. Reduction.FVS If there is a vertex ν of degree at most 1, delete ν .

Concerning vertices of degree 2, observe that, instead of including into the solution any such vertex, we may as well include one of its neighbors.

Reduction.FVS

If there is a vertex ν of degree 2, delete ν and connect its two neighbors by a new edge.
What do we achieve after all these?

After exhaustively applying these four reduction rules, the resulting graph ${\sf G}$

- (P1) contains no loops,
- (P2) has only single and double edges, and
- (P3) has minimum vertex degree at least 3.

Stopping rule.

A rule that stops the algorithm if we already exceeded our budget.

Reduction.FVS

If k < 0, terminate the algorithm and conclude that (G, k) is a no-instance.

A picture :)





 $Y = V(G) \setminus X$





 $\sum_{\nu \in V(G)} \operatorname{degree}(\nu) = 2|\mathsf{E}(G)|$



 $Y = V(G) \setminus X$

$$3|V(G)| \leqslant \sum_{\nu \in V(G)} \operatorname{degree}(\nu) = 2|E(G)|$$



 $1.5|V(G)|\leqslant |\mathsf{E}(G)|$



 $Y = V(G) \setminus X$

$|\mathsf{E}(\mathsf{G})| \leqslant d|\mathsf{X}| + (|\mathsf{V}(\mathsf{G})| - |\mathsf{X}| - 1)$

$1.5|V(G)| \le |E(G)| \le d|X| + (|V(G)| - |X|)$

 $Y = V(G) \setminus X$





$\implies |V(G)|\leqslant 2(d-1)|X|\leqslant 2(d-1)k.$

$1.5|V(G)|\leqslant |\mathsf{E}(G)|\leqslant d|X|+(|V(G)|-|X|)$

 $Y = V(G) \setminus X$



Summarizing:

Lemma If a graph G has minimum degree at least 3, maximum degree at most d, and feedback vertex set of size at most k, then it has less than 2(d-1)k vertices and less than 2(d-1)dk edges.

Summarizing: (possible to prove)

Lemma

If a graph G has minimum degree at least 3, maximum degree at most d, and feedback vertex set of size at most k, then it has less than (d+1)k vertices and less than 2dk edges.

A new rule

Reduction.FVS If $|V(G)| \ge (d+1)k$ or $|E(G)| \ge 2dk$, where d is the maximum degree of G, then terminate the algorithm and return that (G,k) is a no-instance. So what do we need to get the polynomial kernel?

So what do we need to get the polynomial kernel?

Bound the maximum degree of the graph by a polynomial in k.

Part 2: Recap A Tale of **2** Matchings



Consider a bipartite graph one of whose parts (say B) is at least twics as big as the other (call this A).



Assume that there are no isolated vertices in B.





Suppose, further, that for every subset S in $\mathsf{A},$



Suppose, further, that for every subset S in A, N(S) is at least twice as large as |S|.



Then there exist two matchings saturating A,



Then there exist two matchings saturating A,



Then there exist two matchings saturating A, and disjoint in B.

Claim:

If $|B| \ge 2|A|$, then there exists a subset X of A such that:

there exists 2 matchings saturating the subset X that are vertex-disjoint in B.

Claim:

If $|B| \ge 2|A|$, then there exists a subset X of A such that:

there exists 2 matchings saturating the subset X that are vertex-disjoint in B.

Claim:

If $|B| \ge 2|A|$, then there exists a subset X of A such that:

there exists 2 matchings saturating the subset X that are vertex-disjoint in B,

provided B does not have any isolated vertices.

Crucially: it turns out that the endpoints of the matchings in B (the larger set) do not have neighbors outside X.





q-Expansion Lemma

Let $q \geqslant 1$ be a positive integer and G be a bipartite graph with vertex bipartition (A,B) such that

- (i) $|B| \ge q|A|$, and
- (ii) there are no isolated vertices in B.

Then there exist nonempty vertex sets $X\subseteq A$ and $Y\subseteq B$ such that

- there is a q-expansion of X into Y, and
- no vertex in Y has a neighbor outside X, that is, $\mathsf{N}(Y)\subseteq X.$

Furthermore, the sets X and Y can be found in time polynomial in the size of $\mathsf{G}.$

q-Expansion Lemma

Let $q \geqslant 1$ be a positive integer and G be a bipartite graph with vertex bipartition (A,B) such that

- $(i) \ |B| \geqslant q|A|, \, {\rm and} \$
- $(\mathfrak{i}\mathfrak{i})$ there are no isolated vertices in B.

Then there exist nonempty vertex sets $X\subseteq A$ and $Y\subseteq B$ such that

- there is a q-expansion of X into Y, and
- no vertex in Y has a neighbor outside X, that is, $\mathsf{N}(Y)\subseteq X.$

Furthermore, the sets X and Y can be found in time polynomial in the size of $\mathsf{G}.$

We will use this lemma with q = 2.

Part 3 2-Expansions and FVS

• For VERTEX COVER – if a vertex has degree k+1 then we must have it in the solution.

• For VERTEX COVER – if a vertex has degree k + 1 then we must have it in the solution.

What would be the analogous rule for **FEEDBACK VERTEX SET**.

• For VERTEX COVER – if a vertex has degree k + 1 then we must have it in the solution.

What would be the analogous rule for **FEEDBACK VERTEX SET**.

For VERTEX COVER – wanted to hit edges and for FEEDBACK VERTEX SET – want to hit cycles..

FLOWER



k + 1 - vertex disjoint cycles passing through it
Flower Rule.

Reduction.FVS If there is a k + 1-flower passing through a vertex v then $(G \setminus \{v\}, k-1)$.

A subset whose removal makes the graph acyclic.

A polynomial function of k.

Find an approximate feedback vertex set T.

If T does not contain $\nu,$ we are done.

Else: $\nu \in T$. Delete $T \setminus \nu$ from G.

The only remaining cycles pass through ν .

Find an optimal cut set for paths from $N(\nu)$ to $N(\nu).$

When is this cut set small enough?

When is this cut set small enough?

When the largest collection of vertex disjoint paths from N(v) to N(v) is small.

When is this cut set small enough?

When the largest collection of vertex disjoint paths from N(v) to N(v) is *not* small...

When is this cut set small enough?

When the largest collection of vertex disjoint paths from N(v) to N(v) is *not* small... we get a reduction rule.

When is this cut set small enough?

More than k vertex-disjoint paths from $N(\nu)$ to $N(\nu)$

 $\rightarrow \nu$ belongs to *any* feedback vertex set (k + 1-flower) of size at most k.

So either ν "forced", or we have feedback vertex set of suitable size. Notice that we need to arrive at either situation in "polynomial time".

Approximate fvs

• There is a factor 2 approximation algorithm for FEEDBACK VERTEX SET. So use this to get T. If |T| > 2k return no-instance. Else, we have the desired T.

Approximate fvs

- There is a factor 2 approximation algorithm for FEEDBACK VERTEX SET. So use this to get T. If |T| > 2k return no-instance. Else, we have the desired T.
- We have seen if G has minimum degree 3, then any fvs of size at most k contains one among the first 3k vertices of highest degree. Use this to get T of size $3k^2$ or return no-instance.

fvs without ν when $\nu \in \mathsf{T}$.

• $Z_{\nu} = T \setminus \{\nu\} + W$ (something more).

fvs without ν when $\nu \in \mathsf{T}$.

• $Z_{\nu} = T \setminus \{\nu\} + W$ (something more).



fvs without ν when $\nu \in \mathsf{T}$. vForest

W will be a fvs for Forest $+\nu.$

• Check whether there is a k + 1-flower containing ν in Forest $+ \nu$ (if yes then we have reduction rule). (How to find?)

- Check whether there is a k + 1-flower containing ν in Forest $+ \nu$ (if yes then we have reduction rule). (How to find?)
- Else, we can show that there is fvs for Forest $+ \nu$ of size at most 2k.

Book – Gallai Theorem

Theorem (Gallai)

Given a simple graph G, a set $T \subseteq V(G)$ and an integer s, one can in polynomial time find either

- a family of s + 1 pairwise vertex-disjoint T-paths, or
- a set B of at most 2s vertices, such that in G \ B no connected component contains more than one vertex of T.

What did we show.

• For every vertex ν either there is a k + 1-flower passing through ν or there is a Z_{ν} of size at most 4k that does not include ν and is a fvs of G.

What did we show.

- For every vertex ν either there is a k + 1-flower passing through ν or there is a Z_{ν} of size at most 4k that does not include ν and is a fvs of G.
- In the first case we apply Flower Rule.
- •

What did we show.

- For every vertex ν either there is a k + 1-flower passing through ν or there is a Z_{ν} of size at most 4k that does not include ν and is a fvs of G.
- In the first case we apply Flower Rule.
- Assume that the first case does not happen, so we have Z_{ν} of size at most 4k for every vertex $\nu \in V(G)$.



Focussing on the green Part

Consider the connected components of $V(G) \setminus (Z_{\nu} \cup \{\nu\})$.



Could ν have two neighbor in a connected components of $V(G) \setminus (Z_{\nu} \cup \{\nu\})$?







There could be components in $V(G) \setminus (Z_v \cup \{v\})$ that do not see any neighbor of v. Important, for us is that any component contains at most one neighbor of v and we will focus on them.



To bound the degree of $\boldsymbol{\nu}$ or to delete an edge incident to $\boldsymbol{\nu}$ we only focus on those components that contain some (exactly one) neighbor of $\boldsymbol{\nu}$.


To apply 2-expansion lemma we need a bipartite graph. In one part (say B) we will have a vertex for every component in $V(G) \setminus (Z_v \cup \{v\})$ that contains a neighbor of v.



To apply 2-expansion lemma we need a bipartite graph. In one part (say B) we will have a vertex for every component in $V(G) \setminus (Z_v \cup \{v\})$ that contains a neighbor of v. The other part A will be Z_v .



So we have A and B. We put an edge between a vertex x in A and a vertex w in B, if x is adjacent to some vertex in the component represented by the vertex w. Essentially, we have obtained this bipartite graph by contracting the components.

- So we have A and B. We put an edge between a vertex x in A and a vertex w in B, if x is adjacent to some vertex in the component represented by the vertex w. Essentially, we have obtained this bipartite graph by contracting the components.
- If $|B| < 2|A| \le 8k$ then ν already has its degree bounded by 8k. So assume that

|B| > 2|A|

Now by expansion lemma (applied with q=2) we have that there exist nonempty vertex sets $X\subseteq A$ and $Y\subseteq B$ such that

- there is a 2-expansion of X into Y, and
- no vertex in Y has a neighbor outside X, that is, $N(Y) \subseteq X$.





So the reduction rule is:



... and add the following edges if already not present.



Let us argue correctness!

The Forward Direction

The Forward Direction

$\mathrm{FVS} \leqslant k \ \mathrm{in} \ G \Rightarrow \mathrm{FVS} \leqslant k \ \mathrm{in} \ H$



If G has a FVS that either contains ν or all of X, we are in good shape. Consider now a FVS that:

- Does not contain ν ,
- and omits at least one vertex of $\boldsymbol{X}.$







Notice that this does not lead to a larger FVS:

Notice that this does not lead to a larger FVS:

For every vertex ν in X that a FVS of G leaves out,

Notice that this does not lead to a larger FVS:

For every vertex ν in X that a FVS of G leaves out,

it must pick a vertex \boldsymbol{u} that kills no more than all of $\boldsymbol{X}.$

$\mathrm{FVS} \leqslant k \ \mathrm{in} \ \mathsf{G} \Leftarrow \mathrm{FVS} \leqslant k \ \mathrm{in} \ \mathsf{H}$

$\mathrm{FVS} \leqslant k \text{ in } G \Leftarrow \mathrm{FVS} \leqslant k \text{ in } H$

If FVS in H contains ν then the same works for G also as $G \setminus \{\nu\}$ is isomorphic to $H \setminus \{\nu\}$. So assume that FVS in H does not contain ν .



Let W be a FVS of $\mathsf{H},$ the Only Danger for W to be a FVS of $\mathsf{G} \colon$

Cycles that:

- pass through ν ,
- non-neighbors of ν in H (neighbors in G, however)
- and do not pass through X.



Let W be a FVS of H, the Only Danger for W to be a FVS of G:

Cycles that:

- pass through ν ,
- non-neighbors of ν in H (neighbors in G, however)
- and do not pass through X.

However recall that $N(Y) \subseteq X$.



Wrapping Up

• A priori it is not obvious that previous Reduction Rule actually makes some simplification of the graph, since it substitutes some set of edges with some other set of double edges!
Wrapping Up

- A priori it is not obvious that previous Reduction Rule actually makes some simplification of the graph, since it *substitutes some set of edges with some other set of double edges!*
- We need to formally prove that the reduction rules cannot be applied infinitely, or superpolynomially many times.

Final Result

Theorem FEEDBACK VERTEX SET admits a kernel with at most $O(k^2)$ vertices and $O(k^2)$ edges.

Thank You.

Slices Courtesy: Neeldhara Misra and Saket Saurabh.