FPT algorithms for generalized feedback vertex set problems

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Abstract

An r-pseudoforest is a graph in which each component can be made into a forest by deleting at most r edges, and a d-quasi-forest is a graph in which each component can be made into a forest by deleting at most d vertices.

In this paper, we study the parameterized tractability of deleting minimum number of vertices to obtain *r*-pseudoforest and *d*-quasi-forest, generalizing the well studied feedback vertex set problem. We first provide improved FPT algorithm and kernelization results for the *r*-pseudoforest deletion problem and then we show that the *d*-quasi-forest deletion problem is also FPT.

1 Preliminary

The Feedback Vertex Set problem (FVS for short), which asks to delete minimum number of vertices from a given graph to make it acyclic, is one of the 21 NP-hard problems proved by Karp [10]. It has important applications in bio-computing, operating system and artificial intelligence and so on. The problem has attracted a lot of attention from the parameterized complexity community due to its importance. Both its undirected and directed version have been well studied [3, 4, 5, 7].

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Feedback vertex set problem has been proved to be fixed parameter tractable when parameterized with the solution size, that is, the number of vertices allowed to be deleted. For undirected feedback vertex set problem, the state of the art algorithm runs in time $O^*(3.460^k)$ in deterministic setting [9] and $O^*(3^k)$ in the randomized setting [11], here the O^* notation hides polynomial factors in n.

Several classes of graphs that are nearly acyclic have been defined in the litarature. A graph F is called an r-pseudoforest if we can delete at most r edges from each component in F to get a forest. A pseudoforest is a 1-pseudoforest. A graph F is called an *almost* r-forest if we can delete r edges from F to get a forest.

As a generalization of feedback vertex set problem, Philip et al. [13] introduced the problem of deleting vertices to get a graph that is nearly a forest. Several results have been obtained in this line of research. In [13], the authors gave a $O(c_r^k n^{O(1)})$ algorithm for *r*-pseudoforest deletion, which asks to delete at most *k* vertices to get an *r*-pseudoforest. The c_r here depends on *r* doubly exponentially. They also gave a $7.56^k n^{O(1)}$ time algorithm for the problem of pseudoforest deletion.

Rai and Saraub [14] gave a $O^*(5.0024^{(k+r)})$ algorithm for the Almost Forest Deletion problem, which asks to delete minimum vertices to get an almost *r*forest. Lin et al. [12] gave an improved algorithm for this problem that runs in time $O^*(5^k4^r)$. Bodlaender et al. [1] gave an improved algorithm for pseudoforest deletion running in time $O(3^k n k^{O(1)})$.

A d-quasi-forest is a graph in which each connected component admits a feedback vertex set of size at most d. This notion was raised by Hols and Kratsch in [8] in which they show that the Vertex Cover problem admits a polynomial kernel when parameterized with distance to d-quasi-forest. They did not show how to obtain such a modulator to d-quasi-forest.

In this paper, we first give an algorithm for r-pseudoforest deletion that runs in time $(1 + (2r + 3)^{r+2})^{k+1}n^{O(1)}$, improving the algorithm in [13]. We also give an FPT algorithm to obtain a minimum modulator to d-quasi-forest. To the author's acknowledgement, this is the first nontrivial FPT result for d-quasi-forest deletion.

2 Notations and Terminology

Here we give a brief list of the graph theory concepts used in this paper, for other notations and terminology, we refer readers to [2].

For a graph G = (V(G), E(G)), V(G) and E(G) are called its vertex set and edge set respectively. A non-empty graph G is *connected* if there is a path between any pair of vertices, otherwise, we call it *disconnected*. The multiplicity of an edge is the number of copies it appears in the multigraph. An edge uv is called a *loop* if u = v. The *degree* of a vertex is the number of edges incident with it. A *forest* is a graph in which there is no cycle. A *tree* is a connected forest. A graph H = (V(H), E(H)) is a *subgraph* of a graph G = (V(G), E(G)), if $V(H) \subseteq V(G)$ and $E(H) \subseteq E(G)$. A subgraph Hof G is called an *induced subgraph* of G if for any $u, v \in V(G)$, edge $uv \in E(H)$ if and only if $uv \in E(G)$. We also denote H by G[V(H)] to indicate that His induced by the vertex set V(H).

A pseudoforest is a graph in which each connected component can be made into a forest by deleting at most one edge. For a positive integer r, an *r*-pseudoforest is a graph in which each connected component can be made into a forest by deleting at most r edges. A *d*-quasi-forest is a graph in which each component admits a feedback vertex set of size at most d.

3 Branching algorithm for *r*-pseudoforest deletion

Definition 1. Given a graph G = (V, E), a subset $S \subseteq V(G)$ is called an r-pseudoforest deletion set of G if G - S is an r-pseudoforest.

Here is an iterative version of the parameterized r-pseudoforest deletion problem.

r-pseudoforest Deletion

Instance: Graph G with an r-pseudoforest deletion set S, $|S| \leq k + 1$, integers k and r.

Parameter: k and r.

Output: Decide if there exists an *r*-pseudoforest deletion set X of G with $|X| \le k$?

For a connected component C in a graph G, we call the quantity |E(C)| - |V(C)| + 1 the excess of C and denote it by ex(C). Note that $ex(C) \ge 0$ for any connected component. Let C be the set of components in G. We define the excess of G, denoted by ex(G), as $ex(G) = max_{C \in C}ex(C)$ i.e. the maximum excess among all components in G. By definition, G is an r-pseudoforest if and only if $ex(G) \le r$. For vertex subset $S \subseteq V(G)$, let cc(S) = cc(G[S]) be the number of components in G[S].

We give the following observations about r-pseudoforest.

Observation 1: If G' is a subgraph of an *r*-pseudoforest, then G' is also an *r*-pseudoforest.

Observation 2: If G is an r-pseudoforest, then each component C in G has at most |V(C)| - 1 + r edges.

By Observation 2, checking whether a given graph is an r-pseudoforest can be done in polynomial time.

Now we show how to solve the r-pseudoforest deletion via the approach of iterative compression. As a standard step, we introduce the following disjoint version of r-pseudoforest deletion.

Disjoint *r*-pseudoforest Deletion

Input: Graph G with an r-pseudoforest deletion set S, $|S| \le k+1$, integers k and r.

Parameter: k and r.

Output: Decide if there exists an r-pseudoforest deletion set X of G with $|X| \leq k$ and $X \cap S = \emptyset$?

To solve Disjoint r-pseudoforest Deletion, we apply the following reduction rules.

Reduction Rule 1: Let (G, S, k, r) be an instance of Disjoint *r*-pseudoforest Deletion, if there exists a vertex $v \in V(G) \setminus S$ such that $d_G(v) = 1$, then return (G - v, S, k, r).

The correctness of Reduction Rule 1 is easy to prove.

Proof. We show (G, S, k, r) and (G - v, S, k, r) are equivalent instances of Disjoint r-pseudoforest Deletion by proving that they have same solutions.

On the one hand, if $X \subseteq V(G) \setminus S$ is an *r*-pseudoforest deletion set of G disjoint from S, then X is also an *r*-pseudoforest deletion set of G-v. Indeed, if $v \in X$, then G-v-X = G-X, otherwise, G-v-X is a subgraph of G-X, which is an *r*-pseudoforest graph. In both cases, G-X is an *r*-pseudoforest graph.

On the other hand, let $X \subseteq V(G) \setminus S$ be an *r*-pseudoforest deletion set of G - v disjoint from *S*. Let *C* be the component in G - X containing *v*. By definition of *X*, C - v is an *r*-pseudoforest in G - v - X. Since $d_G(v) = 1$, it follows that *C* is also an *r*-pseudoforest in G - X. Furthermore, G - v - X and G - X only differ at component *C*. Thus, $X \subseteq V(G) \setminus S$ is an *r*-pseudoforest deletion set of *G* disjoint from *S*.

Reduction Rule 2: If there exists $v \in V(G) \setminus S$ such that $G[S \cup v]$ is not an *r*-pseudoforest, then return (G - v, S, k - 1, r).

It is obvious that any r-pseudoforest deletion set disjoint from S must contain v.

Reduction Rule 3: If there exists a vertex $u \in V(G) \setminus S$ of degree two, such that at least one neighbor of u' is in $V(G) \setminus S$, then delete u and put a new edge between its two neighbors (even if they were already adjacent). If both incident edges of u are to the same vertex, delete u and put a new loop on the adjacent vertex (even if it has loop(s) already). Now we prove the correctness of Rule 3.

Lemma 1. Reduction Rule 3 is correct.

Proof. Note that the operation decreases both the edge number and vertex number by 1.

On the one hand, let (G, S, k, r) be a yes-instance of Disjoint *r*-pseudoforest Deletion, and let X be an minimal *r*-pseudoforest deletion set of size at most k, which is disjoint from S. Let u be the vertex of degree 2 being deleted from G and G' be the resulting graph. Let x, y be the two neighbors of u in G.

If $u \in X$, then by the minimality of X, the neighbor of u not in S is not in X. Without loss of generality, we may assume that $s \notin S$ and $x \notin X$, then $X' = X \setminus \{u\} \cup \{x\}$ is an r-pseudoforest deletion set of G'. Thus if (G, S, k, r)is a yes instance, then (G', S, k, r) is also a yes instance.

If $u \notin X$, then u is an isolated vertex or in the component containing x or y in G - X. G' - X can be obtained from G - X by deleting u or bypassing it, either way, G' - X is an r-pseudoforest.

On the other hand, let (G', S, k, r) be a yes instance of Disjoint *r*-pseudoforest Deletion, and let X' be an minimal *r*-pseudoforest deletion set of size at most k, which is disjoint from S. If both x, y are not in X', then G - X' can be obtained from G' - X' by subdividing edge xy and name the new vertex u. If at least one of x and y is in X', then u has degree 0 or 1 in G - X. In both cases, G - X' is also an *r*-pseudoforest. It follows that X' is also a solution for (G, S, k, r).

Reduction Rule 4: If k < 0, then return no.

It is easy to see that Rules 1-4 can be applied in polynomial time. Given an instance (G, S, k, r) of Disjoint *r*-pseudoforest Deletion, we first apply Rules 1-4 whenever possible.

Now we show how to handle the case when none of Rules 1-4 can be applied. Define measure $\phi(I) = k + cc(S) + \sum_{C \in \mathcal{C}(G[S])} (r - ex(C))$. Note that initially $\phi(I) \leq k + cc(S) + cc(S)r \leq 2k + (k+1)r + 1 < (k+1)(r+2)$ as $|S| \leq k+1$.

In order to get a depth bounded search tree, we prove that $\phi(I)$ decreases after each application of the following branching rules.

BR-1. Branching on a vertex $v \notin S$ with $d_S(v) \ge 2$.

In one branch, we put v into the solution and call the algorithm on $(G - \{v\}, S, k-1, r)$. Note that in this branch, cc(S), ex(C) (for each $C \in \mathcal{C}(G[S])$) remain the same while k decreases by 1. Hence $\phi(I)$ drops by 1.

In the other branch, we put v into S and call the algorithm on $(G, S \cup \{v\}, k, r)$. Let $S' = S \cup \{v\}$. There are the following two possible cases regarding the distribution of $N_S(v)$.

Case 1: $N_S(v)$ belongs to more than one component in G[S], thus $cc(S') \leq cc(S) - 1$. Let $C_1, C_2, \ldots, C_t (t \geq 2)$ be the set of components in G[S] that are adjacent to v.

To compute the difference between excess sums in S and S', denote

$$\sigma_{S} = \Sigma_{i \in [t]} (r - ex(C_{i}))$$

= $rt - \Sigma_{i \in [t]} (ex(C_{i}))$
= $rt - \Sigma_{i \in [t]} (|E(C_{i})| - |V(C_{i})| + 1)$
= $rt - \Sigma_{i \in [t]} |E(C_{i})| + \Sigma_{i \in [t]} |V(C_{i})| - t$

$$\begin{aligned} \sigma_{S'} &= r - ex(G[\cup_{i \in [t]} V(C_i) \cup \{v\}]) \\ &= r - (|E(\cup_{i \in [r]} V(C_i) \cup \{v\})| - |V(\cup_{i \in [r]} V(C_i) \cup \{v\})| + 1) \\ &= r - (\Sigma_{i \in [r]} |E(C_i)| + d_S(v) - \Sigma_{i \in [r]} |V(C_i)|) \end{aligned}$$

It follows that $\sigma_S - \sigma_{S'} = r(t-1) + d_S(v) - t \ge r(t-1) \ge r$. In this case, $\phi(I)$ drops by at least $1 + \sigma_S - \sigma_{S'} \ge 1 + r(t-1) \ge 1 + r$.

Case 2: All the neighbors of v belong to one component, denoted by C^* . Then cc(S') = cc(S), and $ex(G[V(C^*) \cup \{v\}]) - ex(C^*) \ge 1$ as $d_S(v) \ge 2$. Hence $\phi(I)$ decrease by at least 1.

Therefore, in BR-1, the measure $\phi(I)$ drops by 1 in one case, and at least 1 + r or 1 in the other, while remaining non-negative. In the worst case, it gives us branching vector (1, 1).

Observe that after exhaustive applications of Rule 3 and BR-1, every vertex in G-S has degree at least 3. Moreover, if there exists a vertex $u \notin S$ such that $d_{G-S}(u) \leq 1$, then $d_S(u) \geq 2$. And so if $d_S(u) \leq 1$ holds for each $u \in G - S$, then $d_{G-S}(u) \geq 2$, that is $\delta(G-S) \geq 2$. Thus each $u \in G - S$ must be in a cycle.

If G is not an r-pseudoforest, there must be edges between G-S and S, as we know both G[S] and G-S are r-pseudoforest. In the following, we branch on vertices in G-S adjacent to S.

BR-2. Branching on a vertex $v \notin S$ adjacent to S.

First let us consider the case when there is a component C in G - S such that there is only one edge uv between C and S, where $u \in C$ and $v \in S$. Note that if the solution should intersect V(C), then it suffices to contain u. Thus we may branch on whether u is in the solution or not. If u is in the solution, then k decreases and thus $\phi(I)$ decreases by one. If u is not in the solution, then we put C into S, which greatly decreases the value of r - ex(S), thus $\phi(I)$ also decreases by at least one.

Now assume each component in G - S has at least two edges to S. Look at one shortest path P in G - S, such that both endvertices of P are adjacent to some vertex in S (we allow P to be an isolated vertex). Note that such a shortest path can be found in polynomial time. We prove that $|V(P)| \leq 2r+2$. As any component C in G - S is an r-pseudoforest, $|E(C)| - |V(C)| + 1 \leq r$. Note that each vertex in P has degree at least 3 after exhaustive applications of Rule 3. And observe that no internal vertex of P has an edge to S, otherwise we find a path shorter than P, a contradiction. Let C_0 be the component in G - Scontaining P, we know $|E(C_0)| \geq 3/2|V(P)| - 2$, and $ex(C_0) \geq ex(G[V(P)]) \geq$ 3/2|V(P)| - 2 - |V(P)| + 1. As $ex(C_0) \leq r$, so $|V(P)| \leq 2r + 2$.

We branch on whether to delete any vertex on the path P. Suppose $P = v_1, v_2, \ldots, v_t$. We consider t + 1 branches. In branch i where $i \in [t]$, we delete vertex v_i on path P, and call the algorithm on $(G - \{v_i\}, S, k - 1, r)$. In branch t + 1, we don't delete any vertex on P. Note that for branch i, where $i \leq t$, cc(S), ex(C) (for any $C \in \mathcal{C}(G[S])$) remain the same while k decrease by at least 1. Thus $\phi(I)$ drops by at least 1.

If G[S + V(P)] is not an *r*-pseudoforest, then we ignore branch t + 1. Otherwise, for branch t + 1, we get a new instance (G, S', k, r), where $S' = S \cup V(P)$. If edges between V(P) and S are to the same component C in G[S], then $ex(C \cup V(P)) = ex(C) + 1$, thus in this branch, $\phi(I)$ decrease by 1. Otherwise, the edges between V(P) and S are to different components in G[S]. In this case, cc(S) decreases by 1 and $\sigma_S - \sigma_{S'} \ge 0$, so $\phi(I)$ drops by at least 1. This gives us the (t + 1)-tuple branching vector $(1, 1, \ldots, 1)$ in which $t \le 2r + 2$.

According to the branching vectors in BR-1 and BR-2, the algorithm runs in time $O^*((2r+3)^{(k+1)(r+2)})$.

The following lemma states that a fast parameterized algorithm for the disjoint version problem gives a fast algorithm for the original problem.

Lemma 2. [6] If there is an algorithm sloving Disjiont r-pseudoforest Deletion in time $f(k)n^{O(1)}$, then there is an algorithm solving r-pweudoforest Deletion in time $\sum_{i=0}^{i=k} {k+1 \choose i} f(k-i)n^{O(1)}$.

So we get an algorithm for r-pseudoforest deletion with running time $\sum_{i=0}^{i=k} {k+1 \choose i} (2r+3)^{(k-i+1)(r+2)} < (1+(2r+3)^{r+2})^{k+1}$, which improves over the result in [13]. Our result answers the question raised in [1] on whether there is an algorithm for r-pseudoforest deletion runs in time $O^*(c_k^k)$.

Theorem 1. There exists an algorithm for r-pseudoforest deletion with running time $(1 + (2r + 3)^{r+2})^{k+1}n^{O(1)}$.

4 Kernelization of *r*-pseudoforest deletion

In this section, we give an improved kernel for the r-pseudoforest deletion problem. By exhaustively applying Reduction Rules 1 and 3, we will get an instance with minimum degree at least 3.

Lemma 3. If a graph G has minimum degree at least 3, maximum degree at most d, and an r-pseudoforest deletion set of size at most k, then it has at most (2dr - d + 1)k vertices and at most 3kdr - kd edges.

Proof. Let X be an r-pseudoforest deletion set of G of size at most k. Let F = G - X. It follows that each component in F can be made into a forest by deleting at most r edges. Suppose there are c components in F, we know that $c \leq kd$, since deleting any vertex of degree t produces at most t components. For each component C_i with $i \in [c]$, we know there are at most $|V(C_i)| - 1 + r$ edges. Thus, $|E(F)| = \sum_{i \in [c]} |E(C_i)| \leq \sum_{i \in [c]} (|V(C_i)| - 1 + r) = |V(F)| + c(r - 1)$. By counting the number of edges incident with V(F), we know that

$$3|V(F)| \le 2(|E(F)|) + |E(X, V(F))| \le 2(|V(F)| + c(r-1)) + kd.$$

It follows that $|V(F)| \le 2c(r-1) + kd$. So $|V(G)| \le |X| + |V(F)| \le 2c(r-1) + k(d+1) \le (2dr - d + 1)k$. And $|E(G)| \le |E(F)| + |E(X, V(F))| + |E(G[X])| \le |V(F)| + c(r-1) + kd < 3c(r-1) + 2kd = 3kdr - kd$.

We need to make use of the following result.

Theorem 2 ([13]). Given an instance (G, k) of r-pseudoforest Deletion, in polynomial time, we can get an equivalent instance (G', k') such that $k' \leq k$, $|V(G')| \leq |V(G)|$ and the maximum degree of G' is at most (k+r)(3r+8).

Theorem 3. The r-pseudoforest deletion problem admits a kernel with $O(k^2r^2)$ vertices and $O(k^2r^2)$ edges.

Proof. According to Theorem 2, we know that r-pseudoforest deletion admits a kernel with maximum degree at most d = (k + r)(3r + 8). Thus by Lemma 3, we can obtain a kernel for r-pseudoforest deletion which has at most $(2r - 1)kd + k = O(k^2r^2)$ vertices, and at most $(3r-1)kd = (3r-1)k(k+r)(3r+8) = O(k^2r^2)$ edges.

The kernel in Theorem 3 improves over the kernel in [13], in which the kernel is of size $O(ck^2)$, where the constant c depends on r exponentially.

5 *d*-quasi-forest deletion

Definition 2. Given graph G = (V, E), a subset $S \subseteq V(G)$ is called a *d*-quasi-forest deletion set of G if G - S is a d-quasi-forest.

Let us recall the definition of *d*-quasi-forest deletion first.

d-quasi-forest deletion

Instance: An undirected graph G, an integer k. Parameter: k. Output: Decide if there exists a set $X \subseteq V(G)$ with $|X| \leq k$ such that

G - X is a *d*-quasi-forest.

Lemma 4. A yes instance of d-quasi-forest deletion has treewidth at most k + d + 1.

Proof. Let G be a yes instance of d-quasi-forest deletion, then there is a set $X \subseteq V(G)$, such that each component in G - X has feedback vertex set of size at most d. Thus each component in G - X has treewidth at most d + 1. By putting X into each bag of the tree decomposition for each component in G - X, we obtain a tree decomposition of G, which has treewdith at most k + d + 1. It follows that G has treewidth at most k + d + 1.

We first point out that the problem is FPT according to Courcelle's theorem by expressing it with Monadic Second Logic. The basic idea of the expression is as follows: $\exists v_1, v_2, \ldots, v_k \in V(G)$ such that $\forall X \subseteq V(G) - \{v_1, v_2, \ldots, v_k\}, Conn(X) \to FVS(X) \leq d$. The definition of $FVS(X) \leq d$ is as follows: $\exists y_1, y_2, \ldots, y_d \in X$, such that $\neg ExistsCycle(X - \{y_1, y_2, \ldots, y_d\})$. The definition of ExistsCycle(X) is as follows: $\exists E \subseteq E(G)$, such that Conn(E)and $\forall e \in E, \exists u, v \in X$, such that Inc(u, e) and Inc(v, e) and Deg(u, E) = 2.

Theorem 4. (Courcelle) Given a graph G and a formula φ in Monadic Second Logic describing a property of interest, and parameterizing by the combination of tw(G) and the size of the formula φ , it can be determined in time $f(tw(G), |\varphi|)n^{O(1)}$ whether G has the property of interest.

Theorem 5. The d-quasi-forest deletion problem is FPT parameterized with k and d.

Unfortunately, the algorithm implied by Courcelle's Theorem may be several layers exponential. Aiming at fully exploiting the problem structure and design a faster algorithm, we solve the d-quasi-forest deletion problem by the iterative compression approach. By Guessing the intersection of Z and X, the problem is transformed into the following disjoint version.

Disjoint *d*-quasi-forest deletion

Instance: An undirected graph G, an integer k and a vertex set $Z \subseteq V(G)$ with $|Z| \leq k + 1$ such that G - Z is a d-quasi-forest.

Parameter: k.

Output: Decide if there exists a set $X \in V(G)$ with $|X| \leq k, X \cap Z = \emptyset$ such that G - X is a *d*-quasi-forest.

Denote F = G - Z, then F is a d-quasi-forest, that is, each connected component in F admits feedback vertex set of size at most d. Note that according to the algorithm in [9], we can check whether a given graph is a d-quasi-forest in time $O^*(3.460^d)$.

Reduction Rule 1: If there is a vertex u with degree at most one, then delete u and return a new instance (G - u, k).

Reduction Rule 2: If there is a vertex u with degree exactly two in G, then delete u and add an edge between the neighbors of u.

After exhaustive applications of Reduction Rules 1-2, the resulting instance has minimum degree at least 3.

Reduction Rule 3: Observe that G[Z] is a *d*-quasi-forest, otherwise it is a no-instance. If there is any vertex $u \in V(G)$ such that $G[u \cup V(Z)]$ is not a *d*-quasi-forest, then delete u and decrease k by one.

Lemma 5. Suppose (G, Z, k) is a yes instance of Disjoint d-quasi-forest deletion, then for each vertex $u \in Z$, there are at most k + d components in G - Zthat contains at least one cycle adjacent with u.

Proof. If there are more than k+d components in G-Z, which are adjacent to u, contains a cycle, then for any vertex set $X \subseteq V(G-Z)$, such that $|X| \leq k$, the component containing u in G-X is not a d-quasi-forest. Thus (G, Z, k) is a no instance. It follows that for each vertex $u \in Z$, the sum of the fvs for the components in G-Z that are adjacent to u is at most k+d.

By branching on minimum feedback vertex set of each such component in G - Z, i.e. either put the vertex into the solution or put it into Z, we may obtain a new instance in which every component in G - Z is a tree, moreover, the size of Z is upper bounded by k + 1 + (k + 1)(k + d) = (k + 1)(k + d + 1).

The following lemma provides a bound on the number of trees in G - Z that has large neighborhood in Z.

Lemma 6. Suppose (G, Z, k) is a yes instance of Disjoint d-quasi-forest deletion, then there are at most 2(k+1) + d components in G - Z that has at least d+2 neighbors in Z. Proof. Consider the measure $\mu(I) = cc(Z) + d - fvs(Z) + \omega'(Z)$, in which cc(Z) is the number of components in G[Z] and $\omega'(Z)$ is the maximum number of components in G[Z - D] where D is a minimum feedback vertex set of G[Z]. Note that by putting a component C that has at least d+2 neighbors in Z into Z, either cc(Z) decreases, or fvs(Z) increases, or $\omega'(Z)$ decreases. Indeed, if fvs(Z) does not increase, then D contains no vertex in C, moreover, D contains at most d vertices, thus C connects two components in G[Z - D], and so $\omega'(Z)$ decreases. Since $cc(Z) + d - fvs(Z) + \omega'(Z) \leq 2(k+1) + d$, G - Z of any yes instance contains at most 2(k+1) + d trees that has at least d + 2 neighbors in Z.

Lemma 7. Let (G, Z, k) be a yes instance of disjoint d-quasi-forest deletion, then for each tree in G - Z that has at least d + 2 neighbors in Z, we may partition it into less than 2(2k+d+3) subtrees, each has at most d+1 neighbors in Z, and keep the number of vertices in Z upper bounded.

Proof. Let T be a tree in G - Z that has more than d + 1 neighbors in Z. Suppose on the contrary, we can only partition T into at least 2(2k + d + 3) maximal trees each has at most d + 1 neighbors in Z, then there is a partition of T into 2k + d + 3 smaller trees each has at least d + 2 neighbors in Z(just combining two adjacent subtrees), which is not possible, according to Lemma 6. By branching on the boundaries of the at most 2(2k + d + 3) trees, We reduce the instance into bounded number of new instances, in which each tree has at most d + 1 in Z. Moreover, Z has bounded size, as for each such tree, we put less than 2(2k + d + 3) vertices into Z.

Now we obtain an instance in which G - Z consists of only trees each has at most d + 1 neighbors in Z, where $|Z| < (k + 1)(k + d + 1) + 2(2k + d + 3)(2(k + 1) + d) = O(k^2d^2)$. To obtain an FPT algorithm, we further reduce the number of trees in G - Z.

Definition 3. Two trees T_1, T_2 in G - Z have same **neighborhood type** in Z if $N_Z(T_1) = N_Z(T_2)$ and for any vertex $u \in N_Z(T_1)$, u has only one edge to T_1 if and only if u has only one edge to T_2 .

Reduction Rule 4: For each neighborhood type σ , reduce the number of trees in G - Z that have neighborhood type σ in Z to k + d + 2.

Lemma 8. Reduction Rule 4 is safe.

Proof. Let (G, Z, k) be an instance of disjoint *d*-quasi-forest deletion, such that there are k + d + 3 trees with same neighborhood type σ in Z, which are $T_1, T_2, \ldots, T_{k+d+3}$. By deleting T_{k+d+3} we get a new instance (G', Z, k). Let $N \subseteq Z$ be the common neighborhood of the trees in G - Z.

To prove the safety of Reduction Rule 4, we need to show that (G, Z, k) is a yes instance if and only if (G', Z, k) a yes instance.

On the one hand, it is easy to see that if (G, Z, k) is a yes instance then (G', Z, k) a yes instance as G' is a subgraph of G.

On the other hand, suppose (G', Z, k) is a yes instance. Then there is a set $X \subseteq G-Z$ such that $|X| \leq k$ and each component in G-X admits a feedback vertex set of size at most d. Note that at least d + 2 of $\{T_1, T_2, \ldots, T_{k+d+2}\}$ are disjoint from X, and every two vertices in N will be connected by each of these trees. It follows that G-X contains at least d+2 vertex disjoint paths between every two vertices in N. All vertices in N are in the same connected component C in G-X, thus all except one vertex in N will have to be in the feedback vertex set of C.

Let D be a feedback vertex set of C with size at most d. Note that $T_1, T_2, \ldots, T_{k+d+3}$ are of same neighborhood type in Z, thus, for any vertex $u \in N$, if u forms a cycle with T_{k+d+3} , then it forms a cycle with T_i , for any $i \in [k+d+2]$. Thus if N-D is not empty, then T_{k+d+3} does not form any cycle with the vertex in N-D. And so D is still a feedback vertex set of C when we put T_{k+d+3} back. It follows that (G', Z, k) is also a yes instance.

For each $M \subseteq Z$, there are $2^{|M|}$ different neighborhood types with neighborhood M, depending on whether the number of edges each vertex in M has to the trees is just one.

According to Lemma 8, after exhaustive applications of Reduction Rule 4, there are at most k + d + 2 trees of each neighborhood type.

When each tree in G - Z has at most d + 1 neighbors in Z, there are at most $\sum_{1 \le i \le d+1} {|Z| \choose i} 2^i$ different neighborhood types, and for each neighborhood type, Reduction Rule 4 can be applied in polynomial time.

Theorem 6. (Gallai) Given a simple graph G, a set $R \subseteq V(G)$, and an integer s, one can in polynomial time either

- 1. find a family of s + 1 pairwise vertex-disjoint R-paths, or
- 2. conclude that no such family exists and, moreover, find a set B of at most 2s vertices, such that in $G \setminus B$ no connected component contains more than one vertex of R.

Definition 4. We called a vertex $u \in Z$ forced if for every solution X, every feedback vertex set of size at most d of the component containing u in G - X must contain u.

Note that a vertex $u \in Z$ is a forced vertex if G - Z contains k + d + 1 vertex disjoint paths between neighbors of u. Thus we may set s = k + d, and

then for each vertex $u \in N_Z(T)$, let $R = N_T(u)$, check whether u is a forced vertex via Gallai's Theorem.

We already show that the number of trees in G-Z is upper bounded. We may now guess which trees are intersecting the solution, note that there are at most k such trees. For each guess, we check whether it is compatible, i.e. does putting all the trees (that are guessed to be disjoint with the solution) into Z violate the requirement of d-quasi-forest.

We guess how the components in Z are going to be connected in G - X. For each compatible guess, we need to delete vertices from the trees, such that, the components are separated accordingly. That is, we need to delete vertices from the trees, such that, some components are not going to be connected.

There are bounded number of vertices in Z that are neighbors of G - Z. We can compute the size of minimum feedback vertex set for each component in G[Z]. We may also guess for each vertex in the neighborhood of G - Z in Z, whether it is in the feedback vertex set or not.

We label each component with the size of its minimum feedback vertex set.

Lemma 9. The problem reduces to bounded number of instances in which G - Z consists of at most k trees, each has at most d + 1 neighbors in Z, moreover, each tree contains at most $k\binom{p}{2} + k|N_2| + (k+1)(k\binom{p}{2} + k|N_2|)$ vertices, where $p \leq k+1$.

Proof. Since G - Z contains at most k trees, we know that $N = N_Z(G - Z)$ contains at most k(d+1) vertices. For each vertex $u \in N$, we decide whether it is a forced vertex via Gallai's Theorem. Thus we obtain a partition of $N = N_1 \cup N_2$, where N_1 contains all the forced vertices. According to Gallai's Theorem, for each vertex $u \in N_2$, we can find a set B_u with at most 2(k+d) vertices, such that each component in $G-Z-B_u$ contains at most one neighbor of u. Thus, by branching on whether each vertex in B_u is in the solution, we may partition each tree T_i in G-Z into subtrees, which contains at most one neighbor of each vertex in $B_u \cup N_2$.

We apply reduction rule 4 again to reduce the number of trees. And then we further reduce the instance by guessing how the trees are going to intersecting with the solution. Easy to know that, there are at most k trees in the reduced instance, moreover, each tree in G - Z contains at most one neighbor of each vertex in $N_2 \cup (\bigcup_{u \in N_2} B_u)$.

Now we show how to bound the size of each tree. We guess how the component are going to be separated in G-X where X is a minimum d-quasiforest deletion set of (G, Z, k). There are bounded number of such guesses. And then, we check whether the guessing can be realized. To simplify, we may regard all vertices in the same component from N_1 as one vertex. For two vertices $u, v \in N_1$ that are guessed to be in different components, there are at most k vertices in the trees that are adjacent to both u and v, since otherwise, deleting X cannot separate u and v. Thus the total number of vertices that have neighbors in two guessed components must be upper bounded. Suppose we guessed there to be p components, then at most $\binom{p}{2}$ pairs of vertices in the components. It follows that there are at most $k\binom{p}{2}$ vertices in the trees that have neighbors in different guessed components.

And we also know that in each tree, the number of vertices that are adjacent to $N_2 \cup (\bigcup_{u \in N_2} B_u)$ is upper bounded, since each tree contains at most one neighbor of each vertex in $N_2 \cup (\bigcup_{u \in N_2} B_u)$. Thus we only need to bound the number of vertices that are not adjacent to $N_2 \cup (\bigcup_{u \in N_2} B_u)$ and only have neighbors in just one component. We bound this by arguing that there is no need to keep too many such vertices in the same tree, since such vertices only connecting vertices that are guessed to be in the same components, moreover, their neighbors in Z are forced to be in the feedback vertex sets, thus the number of such vertices does not affect the solution. In each tree, for each path connecting neighbors of $N_2 \cup (\bigcup_{u \in N_2} B_u)$ and vertices with neighbors in more than one components, we just keep at one vertex that are adjacent to one component in Z (note that there are at most k + 1 components).

Thus we obtain a bound on the size of each tree in G - Z, moreover, there are at most k tree. Each tree in the reduced instance will have at most $k\binom{p}{2} + k|N_2| + (k+1)(k\binom{p}{2} + k|N_2|)$ vertices. And so we can solve the reduced instance in fpt time by branching on the vertices in G - Z, which has bounded number of vertices.

Theorem 7. The d-quasi-forest deletion problem can be solved in time $O^*(c_1^{(k+d)c_2(k+d)}).$

Proof. We solve the Disjoint d-quasi-forest deletion problem as a subroutine. It takes at most $O^*((2^{k+d})^{k+1})$ steps to make G - Z acyclic. And it takes at most $O^*(2^{2(2k+d+3)^{2k+2+d}})$ steps to apply lemma 6. It take $\sum_{1 \le i \le d+1} {\binom{|Z|}{i}} 2^i$ steps to exhaustively apply Reduction Rule 4. It takes at most 2^{2k+d+2} guesses to get an instance in which there are at most k trees in G - Z. For each instance, in which there are at most k trees each has at most d + 1 neighbors in Z, we can reduce it into bounded number of instances, where each tree has bounded size. And finally, we just need to solve instances in which G - Z contains at most k trees, each has at most $k^{\binom{p}{2}} + k|N_2| + (k + 1)(k\binom{p}{2} + k|N_2|) = O(k^4d)$ vertices. Thus it takes at most $O^*(2^{k^5d})$ steps to solve each such instance via branching. According to the above analysis, the running time of our algorithm for Disjoint d-quasi-forest deletion is at most $(2^{k+d})^{k+1}2^{2(2k+d+3)} \sum_{1 \le i \le d+1} {|Z| i \choose i} 2^i 2^{2k+d+2} 2^{k^5d} = O^*(c_1^{(k+d)}c_2^{(k+d)})$.

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To solve *d*-quasi-forest deletion, it suffices to solve $2^{|Z|} \leq 2^{k+1}$ copies of Disjoint *d*-quasi-forest deletion, thus, we may solve *d*-quasi-forest deletion in time $O^*(c_1^{(k+d)c_2(k+d)})$.

6 Conclusion

In this paper, we provide FPT results for two generalized versions of feedback vertex set problem. It would be interesting to know whether the problem of *d*-quasi-forest deletion admits a polynomial kernel.

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