#### **GRUNDY DISTINGUISHES TREEWIDTH FROM PATHWIDTH\*** 1

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#### Abstract.

4

5 Structural graph parameters, such as treewidth, pathwidth, and clique-width, are a central topic 6 of study in parameterized complexity. A main aim of research in this area is to understand the "price of generality" of these widths: as we transition from more restrictive to more general notions, 7 8 which are the problems that see their complexity status deteriorate from fixed-parameter tractable 9 to intractable? This type of question is by now very well-studied, but, somewhat strikingly, the algorithmic frontier between the two (arguably) most central width notions, treewidth and pathwidth, 11 is still not understood: currently, no natural graph problem is known to be W-hard for one but FPT 12 for the other. Indeed, a surprising development of the last few years has been the observation that for many of the most paradigmatic problems, their complexities for the two parameters actually 13 14coincide exactly, despite the fact that treewidth is a much more general parameter. It would thus appear that the extra generality of treewidth over pathwidth often comes "for free". 15

16 Our main contribution in this paper is to uncover the first natural example where this generality 17 comes with a high price. We consider GRUNDY COLORING, a variation of coloring where one seeks 18to calculate the worst possible coloring that could be assigned to a graph by a greedy First-Fit 19algorithm. We show that this well-studied problem is FPT parameterized by pathwidth; however, it 20 becomes significantly harder (W[1]-hard) when parameterized by treewidth. Furthermore, we show 21that GRUNDY COLORING makes a second complexity jump for more general widths, as it becomes 22 paraNP-hard for clique-width. Hence, GRUNDY COLORING nicely captures the complexity trade-offs 23 between the three most well-studied parameters. Completing the picture, we show that GRUNDY 24 COLORING is FPT parameterized by modular-width.

25Key words. Treewidth, Pathwidth, Clique-width, Grundy Coloring

26 1. Introduction. The study of the algorithmic properties of structural graph 27 parameters has been one of the most vibrant research areas of parameterized complexity in the last few years. In this area we consider graph complexity measures 28("graph width parameters"), such as treewidth, and attempt to characterize the class 29 of problems which become tractable for each notion of width. The most important 30 graph widths are often comparable to each other in terms of their generality. Hence, 31 32 one of the main goals of this area is to understand which problems separate two comparable parameters, that is, which problems transition from being FPT for a more 33 restrictive parameter to W-hard for a more general one<sup>1</sup>. This endeavor is sometimes 34 referred to as determining the "price of generality" of the more general parameter. 35

Treewidth and pathwidth, which have an obvious containment relationship to each 36 37 other, are possibly the two most well-studied graph width parameters. Despite this, to the best of our knowledge, no natural problem is currently known to delineate their 38

<sup>\*</sup>Submitted to the editors 12/12/2020. A conference version of this paper appeared in ESA 2020. Funding: All authors supported under the PRC CNRS JSPS 2019-2020 program, project PARAGA (Parameterized Approximation Graph Algorithms). Rémy Belmonte was partially supported by JSPS KAKENHI Grant Number JP18K11157. Eun Jung Kim and Michael Lampis were partially supported by ANR JCJC Grant Number 18-CE40-0025-01 (ASSK) and 21-CE48-0022 (S-EX-AP-PE-AL). Yota Otachi was partially supported by JSPS KAKENHI Grant Numbers JP18K11168, JP18K11169, JP18H04091.

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 $<sup>^{1}</sup>$ We assume the reader is familiar with the basics of parameterized complexity theory, such as the classes FPT and W[1], as given in standard textbooks [23]. 1

complexity border in the sense we just described. Our main contribution is exactly to 39 40 uncover a natural, well-known problem which fills this gap. Specifically, we show that GRUNDY COLORING, the problem of ordering the vertices of a graph to maximize the 41 number of colors used by the First-Fit coloring algorithm, is FPT parameterized by 42 pathwidth, but W[1]-hard parameterized by treewidth. We then show that GRUNDY 43 COLORING makes a further complexity jump if one considers clique-width, as in this 44 case the problem is paraNP-complete. Hence, GRUNDY COLORING turns out to be an 45 interesting specimen, nicely demonstrating the algorithmic trade-offs involved among 46 the three most central graph widths. 47

Graph widths and the price of generality. Much of modern parameterized com-48 plexity theory is centered around studying graph widths, especially treewidth and 4950 its variants. In this paper we focus on the parameters summarized in Figure 1, and especially the parameters that form a linear hierarchy, from vertex cover, to treedepth, pathwidth, treewidth, and clique-width. Each of these parameters is a strict 52generalization of the previous ones in this list. On the algorithmic level we would 53 expect this relation to manifest itself by the appearance of more and more problems 5455which become *intractable* as we move towards the more general parameters. Indeed, a search through the literature reveals that for each step in this list of parameters, 56 several *natural* problems have been discovered which distinguish the two consecutive 57parameters (we give more details below). The one glaring exception to this rule seems 58 to be the relation between treewidth and pathwidth. 59

Treewidth is a parameter of central importance to parameterized algorithmics, in 60 61 part because wide classes of problems (notably all  $MSO_2$ -expressible problems [20]) are FPT for this parameter. Treewidth is usually defined in terms of tree decomposi-62 tions of graphs, which naturally leads to the equally well-known notion of pathwidth, 63 defined by forcing the decomposition to be a path. On a graph-theoretic level, the 64 difference between the two notions is well-understood and treewidth is known to de-65 scribe a much richer class of graphs. In particular, while all graphs of pathwidth k have 66 67 treewidth at most k, there exist graphs of constant treewidth (in fact, even trees) of unbounded pathwidth. Naturally, one would expect this added richness of treewidth 68 to come with some negative algorithmic consequences in the form of problems which 69 are FPT for pathwidth but W-hard for treewidth. Furthermore, since treewidth and 70 pathwidth are probably the most studied parameters in our list, one might expect the 71problems that distinguish the two to be the first ones to be discovered. 72

73 Nevertheless, so far this (surprisingly) does not seem to have been the case: on the one hand, FPT algorithms for pathwidth are DPs which also extend to treewidth; 74on the other hand, we give (in Section 1.1) a semi-exhaustive list of dozens of natural 75 problems which are W[1]-hard for treewidth and turn out without exception to also 76 77 be hard for pathwidth. In fact, even when this is sometimes not explicitly stated in 78 the literature, the same reduction that establishes W-hardness by treewidth also does so for pathwidth. Intuitively, an explanation for this phenomenon is that the basic 79 structure of such reductions typically resembles a  $k \times n$  (or smaller) grid, which has 80 both treewidth and pathwidth bounded by k. 81

Our main motivation in this paper is to take a closer look at the algorithmic barrier between pathwidth and treewidth and try to locate a natural (that is, not artificially contrived) problem whose complexity transitions from FPT to W-hard at this barrier. Our main result is the proof that GRUNDY COLORING is such a problem. This puts in the picture the last missing piece of the puzzle, as we now have natural problems that distinguish the parameterized complexity of any two consecutive parameters in our main hierarchy.



Parameter	Result	Ref
Clique-width	paraNP-hard	Thm $5.5$
Treewidth	W[1]-hard	Thm $3.14$
Pathwidth	FPT	Thm $4.3$
Modular-width	FPT	Thm $6.7$

In the figure, clique-width, treewidth, pathwidth, tree-depth, vertex cover, feedback vertex set, neighborhood diversity, and modular-width are indicated as cw, tw, pw, td, vc, fvs, nd, and mw respectively. Arrows indicate more general parameters. Dotted arrows indicate that the parameter may increase exponentially, (e.g. graphs of vc khave nd at most  $2^k + k$ ).

Fig. 1: Summary of considered graph parameters and results.

Grundy Coloring. In the GRUNDY COLORING problem we are given a graph 89 G = (V, E) and are asked to order V in a way that maximizes the number of colors 90 used by the greedy (First-Fit) coloring algorithm. The notion of Grundy coloring was 91 first introduced by Grundy in the 1930s, and later formalized in [19]. Since then, the 93 complexity of GRUNDY COLORING has been very well-studied (see [1, 3, 16, 33, 48, 50, 57, 61, 82, 84, 86, 87, 88] and the references therein). For the natural parameter, 94 namely the number of colors to be used, Grundy coloring was recently proved to 95 be W[1]-hard in [1]. An XP algorithm for GRUNDY COLORING parameterized by 96 treewidth was given in [84], using the fact that the Grundy number of any graph 97 is at most  $\log n$  times its treewidth. In [15] Bonnet et al. explicitly asked whether 98 99 this can be improved to an FPT algorithm. They also observed that the problem is FPT parameterized by vertex cover. It appears that the complexity of GRUNDY 100 COLORING parameterized by pathwidth was never explicitly posed as a question and 101 it was not suspected that it may differ from that for treewidth. We note that, since 102the problem can be seen to be MSO<sub>1</sub>-expressible for a fixed Grundy number (indeed in 103 Definition 2.1 we reformulate it as a coloring problem where each color class dominates 104later classes, which is an MSO<sub>1</sub>-expressible property), it is FPT for all considered 105parameters if the Grundy number is also a parameter [21], so we intuitively want to 106 concentrate on cases where the Grundy number is large. 107

Our results. Our results illuminate the complexity of GRUNDY COLORING pa rameterized by pathwidth and treewidth, as well as clique-width and modular-width.
 More specifically:

111 1. We show that GRUNDY COLORING is W[1]-hard parameterized by treewidth 112 via a reduction from k-MULTI-COLORED CLIQUE. The main building block 113 of our reduction is the structure of binomial trees, which have treewidth one 114 but unbounded pathwidth, which explains the complexity jump between the 115 two parameters. As mentioned, an XP algorithm is known in this case [84], 116 so this result is in a sense tight.

We observe that GRUNDY COLORING is FPT parameterized by pathwidth.
 Our main tool here is a combinatorial lemma stating that on any graph the
 Grundy number is at most a linear function of the pathwidth, which was
 first shown in [27], using previous results on the First-Fit coloring of interval

121 graphs [58, 74]. To obtain an FPT algorithm we simply combine this lemma 122 with the algorithm of [84].

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3. We show that GRUNDY COLORING is paraNP-complete parameterized by clique-width, that is, NP-complete for graphs of constant clique-width (specifically, clique-width 8).

4. We show that GRUNDY COLORING is FPT parameterized by neighborhood diversity (which is defined in [62]) and leverage this result to obtain an FPT algorithm parameterized by modular-width (which is defined in [42]).

Our main interest is concentrated in the first two results, which achieve our goal of finding a natural problem distinguishing pathwidth from treewidth. The result for clique-width nicely fills out the picture by giving an intuitive view of the evolution of the complexity of the problem and showing that in a case where no non-trivial bound can be shown on the optimal value, the problem becomes hopelessly hard from the parameterized point of view.

Other related work. Let us now give a brief survey of "price of generality" results 135involving our considered parameters, that is, results showing that a problem is efficient 136for one parameter but hard for a more general one. In this area, the results of Fomin 137138 et al. [38], introducing the term "price of generality", have been particularly impactful. This work and its follow-ups [39, 40], were the first to show that four natural 139graph problems (COLORING, EDGE DOMINATING SET, MAX CUT, HAMILTONICITY) 140 which are FPT for treewidth, become W[1]-hard for clique-width. In this sense, these 141problems, as well as problems discovered later such as counting perfect matchings 142 143[22], SAT [77, 25],  $\exists \forall$ -SAT [66], ORIENTABLE DELETION [49], and d-REGULAR IN-DUCED SUBGRAPH [18], form part of the "price" we have to pay for considering a more 144 general parameter. This line of research has thus helped to illuminate the complex-145ity border between the two most important sparse and dense parameters (treewidth 146and clique-width), by giving a list of *natural* problems distinguishing the two. (An 147artificial  $MSO_2$ -expressible such problem was already known much earlier [21, 64]). 148

149 Let us now focus in the area below treewidth in Figure 1 by considering problems which are in XP but W[1]-hard parameterized by treewidth. By now, there is a 150small number of problems in this category which are known to be W[1]-hard even 151for vertex cover: LIST COLORING [34] was the first such problem, followed by CSP 152(for the vertex cover of the dual graph) [79], and more recently by (k, r)-CENTER, d-153SCATTERED SET, and MIN POWER STEINER TREE [54, 53, 55] on weighted graphs. 154Intuitively, it is not surprising that problems W[1]-hard parameterized by vertex cover 155are few and far between, since this is a very restricted parameter. Indeed, for most 156problems in the literature which are W[1]-hard by treewidth, vertex cover is the only 157parameter (among the ones considered here) for which the problem becomes FPT. 158

A second interesting category are problems which are FPT for tree-depth ([75]) but W[1]-hard for pathwidth. MIXED CHINESE POSTMAN PROBLEM was the first discovered problem of this type [47], followed by MIN BOUNDED-LENGTH CUT [28, 11], ILP [44], GEODETIC SET [56] and unweighted (k, r)-CENTER and *d*-SCATTERED SET [54, 53]. More recently,  $(A, \ell)$ -PATH PACKING was also shown to belong in this category [6].

To the best of our knowledge, for all remaining problems which are known to be W[1]-hard by treewidth, the reductions that exist in the literature also establish W[1]-hardness for pathwidth. Below we give a (semi-exhaustive) list of problems which are known to be W[1]-hard by treewidth. After reviewing the relevant works we have verified that all of the following problems are in fact shown to be W[1]-hard

parameterized by pathwidth (and in many case by feedback vertex set and tree-depth), 170 even if this is not explicitly claimed. 171

- 1.1. Known problems which are W-hard for treewidth and for pathwidth. 173• PRECOLORING EXTENSION and EQUITABLE COLORING are shown to be W[1]-174hard for both tree-depth and feedback vertex set in [34] (though the result 175is claimed only for treewidth). This is important, because EQUITABLE COL-176ORING often serves as a starting point for reductions to other problems. A 177 second hardness proof for this problem was recently given in [24]. These two 178problems are FPT by vertex cover [36]. 179• CAPACITATED DOMINATING SET and CAPACITATED VERTEX COVER are 180 W[1]-hard for both tree-depth and feedback vertex set [26] (though again the 181 result is claimed for treewidth). 182• MIN MAXIMUM OUT-DEGREE on weighted graphs is W[1]-hard by tree-depth 183and feedback vertex set [81]. 184• GENERAL FACTORS is W[1]-hard by tree-depth and feedback vertex set [80]. 185186 • TARGET SET SELECTION is W[1]-hard by tree-depth and feedback vertex set [10] but FPT for vertex cover [76]. 187• BOUNDED DEGREE DELETION is W[1]-hard by tree-depth and feedback ver-188 tex set, but FPT for vertex cover [12, 43]. 189• FAIR VERTEX COVER is W[1]-hard by tree-depth and feedback vertex set 190 191 [60].• FIXING CORRUPTED COLORINGS is W[1]-hard by tree-depth and feedback 192vertex set [13] (reduction from PRECOLORING EXTENSION). 193 • MAX NODE DISJOINT PATHS is W[1]-hard by tree-depth and feedback vertex 194 set [32, 37]. 195• DEFECTIVE COLORING is W[1]-hard by tree-depth and feedback vertex set 196197 [9]. • POWER VERTEX COVER is W[1]-hard by tree-depth but open for feedback 198 vertex set [2]. 199 • MAJORITY CSP is W[1]-hard parameterized by the tree-depth of the inci-200dence graph [25]. 201 • LIST HAMILTONIAN PATH is W[1]-hard for pathwidth [71]. 202 203 • L(1,1)-COLORING is W[1]-hard for pathwidth, FPT for vertex cover [36]. • COUNTING LINEAR EXTENSIONS of a poset is W[1]-hard (under Turing re-204 ductions) for pathwidth [29]. 205 • EQUITABLE CONNECTED PARTITION is W[1]-hard by pathwidth and feedback 206vertex set, FPT by vertex cover [31]. 207• SAFE SET is W[1]-hard parameterized by pathwidth, FPT by vertex cover 208[8]. 209 • MATCHING WITH LOWER QUOTAS is W[1]-hard parameterized by pathwidth 210 [4].211 • SUBGRAPH ISOMORPHISM is W[1]-hard parameterized by the pathwidth of 212G, even when G, H are connected planar graphs of maximum degree 3 and 213 214 H is a tree [70]. • METRIC DIMENSION is W[1]-hard by pathwidth [17]. This was recently 215strengthened to paraNP-hardness [68], again for pathwidth. 216 • SIMPLE COMPREHENSIVE ACTIVITY SELECTION is W[1]-hard by pathwidth 217218
  - [30].

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- DEFENSIVE STACKELBERG GAME FOR IGL is W[1]-hard by pathwidth (reduction from EQUITABLE COLORING) [5].
- DIRECTED (p,q)-EDGE DOMINATING SET is W[1]-hard parameterized by pathwidth [7].
  - MAXIMUM PATH COLORING is W[1]-hard for pathwidth [63].
- Unweighted k-SPARSEST CUT is W[1]-hard parameterized by the three combined parameters tree-depth, feedback vertex set, and k [51].
- GRAPH MODULARITY is W[1]-hard parameterized by pathwidth plus feedback vertex set [72].
- MINIMUM STABLE CUT is W[1]-hard parameterized by pathwidth [65].

Let us also mention in passing that the algorithmic differences of pathwidth and 229230 treewidth may also be studied in the context of problems which are hard for constant treewidth. Such problems also generally remain hard for constant pathwidth (exam-231ples are STEINER FOREST [46], BANDWIDTH [73], MINIMUM MCUT [45]). One could 232 also potentially try to distinguish between pathwidth and treewidth by considering 233the parameter dependence of a problem that is FPT for both. Indeed, for a long time 234the best-known algorithm for DOMINATING SET had complexity  $3^k$  for pathwidth, 235 but  $4^k$  for treewidth. Nevertheless, the advent of fast subset convolution techniques 236 [85], together with tight SETH-based lower bounds [69] has, for most problems, shown 237that the complexities on the two parameters coincide exactly. 238

Finally, let us mention a case where pathwidth and treewidth have been shown 239 to be quite different in a sense similar to our framework. In [78] Razgon showed that 240 241 a CNF can be compiled into an OBDD (Ordered Binary Decision Diagram) of size 242 FPT in the pathwidth of its incidence graphs, but there exist formulas that always need OBDDs of size XP in the treewidth. Although this result does separate the 243 two parameters, it is somewhat adjacent to what we are looking for, as it does not 244speak about the complexity of a decision problem, but rather shows that an OBDD-245producing algorithm parameterized by treewidth would need XP time simply because 246247 it would have to produce a huge output in some cases.

248 **2. Definitions and Preliminaries.** For non-negative integers i, j, we use [i, j]249 to denote the set  $\{k \mid i \leq k \leq j\}$ . Note that if j < i, then the set [i, j] is empty. We 250 will also write simply [i] to denote the set [1, i].

251 We give two equivalent definitions of our main problem.

DEFINITION 2.1. A k-Grundy Coloring of a graph G = (V, E) is a partition of V into k non-empty sets  $V_1, \ldots, V_k$  such that: (i) for each  $i \in [k]$  the set  $V_i$  induces an independent set; (ii) for each  $i \in [k-1]$  the set  $V_i$  dominates the set  $\bigcup_{i < j < k} V_j$ .

DEFINITION 2.2. A k-Grundy Coloring of a graph G = (V, E) is a proper kcoloring  $c : V \to [k]$  that results by applying the First-Fit algorithm on an ordering of V; the First-Fit algorithm colors one by one the vertices in the given ordering, assigning to a vertex the minimum color that is not already assigned to one of its preceding neighbors.

The Grundy number of a graph G, denoted by  $\Gamma(G)$ , is the maximum k such that G admits a k-Grundy Coloring. In a given Grundy Coloring, if  $u \in V_i$  (equiv. if c(u) = i) we will say that u was given color i. The GRUNDY COLORING problem is the problem of determining the maximum k for which a graph G admits a k-Grundy Coloring. It is not hard to see that a proper coloring is a Grundy coloring if and only if every vertex assigned color i has at least one neighbor assigned color j, for each j < i. **3.** W[1]-Hardness for Treewidth. In this section we prove that GRUNDY COLORING parameterized by treewidth is W[1]-hard (Theorem 3.14). Our proof relies on a reduction from k-MULTI-COLORED CLIQUE and initially establishes W[1]hardness for a more general problem where we are given a target color for a set of vertices (Lemma 3.6); we then reduce this to GRUNDY COLORING.

An interesting aspect of our reduction is that up until a rather advanced point, 272the instance we construct has not only bounded treewidth (which is necessary for the construction to work), but also bounded pathwidth (see Lemma 3.10). This would 274seem to indicate that we are headed towards a W[1]-hardness result for GRUNDY 275COLORING parameterized by pathwidth, which would contradict the FPT algorithm 276of Section 4! This is of course not the case, so it is instructive to ponder why the 277reduction fails to work for pathwidth. The reason this happens is that the final step, 278 which reduces our instance to the plain version of GRUNDY COLORING needs to rely 279on a support operation that "pre-colors" some of the vertices and the gadgets we 280use to achieve this are trees of unbounded Grundy number. The results of Section 4 281indicate that if these gadgets have unbounded Grundy number, thay *must* also have 282 283 unbounded pathwidth, hence there is a good combinatorial reason why our reduction only works for treewidth. 284

Let us now present the different parts of our construction. We will make use of the structure of binomial trees  $T_i$ .

DEFINITION 3.1. The binomial tree  $T_i$  with root  $r_i$  is a rooted tree defined recursively in the following way:  $T_1$  consists simply of its root  $r_1$ ; in order to construct  $T_i$ for i > 1, we construct one copy of  $T_j$  for all j < i and a special vertex  $r_i$ , then we connect  $r_j$  with  $r_i$ . An alternative equivalent definition of the binomial tree  $T_i$ ,  $i \ge 2$ is that we construct two trees  $T_{i-1}$ ,  $T'_{i-1}$ , we connect their roots  $r_{i-1}$ ,  $r'_{i-1}$  and select one of them as the new root  $r_i$ .

PROPOSITION 3.2. Let  $i \ge 2$ ,  $T_i$  be a binomial tree and  $1 \le t < i$ . There exist 294  $2^{i-t-1}$  binomial trees  $T_t$  which are vertex-disjoint and non-adjacent subtrees in  $T_i$ , 295 where no  $T_t$  contains the root  $r_i$  of  $T_i$ .

296 Proof. By induction in i-t. For i-t = 1,  $T_i$  indeed contains one  $T_{i-1}$  that does 297 not contain the root  $r_i$ . Let it be true that  $T_{i-1}$  contains  $2^{i-t-2}$  subtrees  $T_t$ . Then 298  $T_i$  contains two trees  $T_{i-1}$  each of which contains  $2^{i-t-2} T_j$ , thus  $2^{i-t-1}$  in total.  $\Box$ 

299 PROPOSITION 3.3.  $\Gamma(T_i) \leq i$ . Furthermore, for all  $j \leq i$  there exists a Grundy 300 coloring which assigns color j to the root of  $T_i$ .

*Proof.* The first part is trivial since in any graph G with maximum degree  $\Delta$  we 301 have  $\Gamma(G) \leq \Delta + 1$ . In this case  $\Gamma(T_i) \leq (i-1) + 1 = i$ . For the second part, we 302 303 first prove that there is a Grundy coloring which assigns color i to the root. This can be proven by strong induction: if for all k < i, there is a Grundy coloring which 304 assigns color k to  $r_k$  for all  $1 \le k \le i-1$ , then under this coloring,  $r_i$  has at least one 305 neighbor receiving color k for all  $1 \le k \le i-1$ , so it has to receive color i. To assign 306 to the root a color j < i we observe that if j = 1 this is trivial; if j > 1, we use the 307 fact that (by inductive hypothesis) there is a coloring that assigns color j - 1 to  $r_j$ , 308 309 so in this coloring the root  $r_i$  will take color j. П

A Grundy coloring of  $T_i$  that assigns color i to  $r_i$  is called *optimal*. If  $r_i$  is assigned color j < i then we call the Grundy coloring *sub-optimal*.

We now define a generalization of the Grundy coloring problem with target colors and show that it is W[1]-hard parameterized by treewidth. We later describe how to reduce this problem to GRUNDY COLORING such that the treewidth does not increase 315 by a lot.

316 DEFINITION 3.4 (GRUNDY COLORING WITH TARGETS). We are given a graph 317 G(V, E), an integer  $t \in \mathbb{N}$  called the target and a subset  $S \subset V$ . (For simplicity 318 we will say that vertices of S have target t.) If G admits a Grundy Coloring which 319 assigns color t to some vertex  $s \in S$  we say that, for this coloring, vertex s achieves 320 its target. If there exists a Grundy Coloring of G which assigns to all vertices of S 321 color t, then we say that G admits a Target-achieving Grundy Coloring. GRUNDY 322 COLORING WITH TARGETS is the decision problem associated to the question "given 323 G, S, t as defined above, does G admit a Target-achieving Grundy Coloring?".

324 We will also make use of the following operation:

BEFINITION 3.5 (Tree-support). Given a graph G = (V, E), a vertex  $u \in V$  and a set N of positive integers, we define the tree-support operation as follows: (a) for all  $i \in N$  we add a copy of  $T_i$  in the graph; (b) we connect u to the root  $r_i$  of each of the  $T_i$ . We say that we add supports N on u. The trees  $T_i$  will be called the supporting trees or supports of u. Slightly abusing notation, we also call supports the numbers  $i \in N$ .

Intuitively, the tree-support operation ensures that vertex u may have at least one neighbor of color i for each  $i \in N$  in a Grundy coloring, and thus increase the color u can take. Observe that adding supporting trees to a vertex does not increase the treewidth, but does increase the pathwidth (binomial trees have unbounded pathwidth).

Our reduction is from k-MULTI-COLORED CLIQUE, proven to be W[1]-hard in [35]: given a k-multipartite graph  $G = (V_1, V_2, \ldots, V_k, E)$ , decide if for every  $i \in [k]$  we can pick  $u_i \in V_i$  forming a clique, where k is the parameter. We can also assume that  $\forall i \in [k], |V_i| = n$ , that n is a power of 2, and that  $V_i = \{v_{i,0}, v_{i,1}, \ldots, v_{i,n-1}\}$ . Furthermore, let |E| = m. We construct an instance of GRUNDY COLORING WITH TARGETS G' = (V', E') and  $t = 2 \log n + 4$  (where all logarithms are base two) using the following gadgets:

343 Vertex selection  $S_{i,j}$ . See Figure 2a. This gadget consists of  $2 \log n$  vertices  $S_{i,j}^1 \cup S_{i,j}^2 = \bigcup_{l \in [\log n]} \{s_{i,j}^{2l-1}\} \cup \bigcup_{l \in [\log n]} \{s_{i,j}^{2l}\}$ , where for each  $l \in [\log n]$  we connect 345 vertex  $s_{i,j}^{2l-1}$  to  $s_{i,j}^{2l}$  thus forming a matching. Furthermore, for each  $l \in$ 346  $[2, \log n]$ , we add supports [2l-2] to vertices  $s_{i,j}^{2l-1}$  and  $s_{i,j}^{2l}$ . Observe that the 347 vertices  $s_{i,j}^{2l-1}$  and  $s_{i,j}^{2l}$  together with their supports form a binomial tree  $T_{2l}$ 348 with either of these vertices as the root. We construct k(m+2) gadgets  $S_{i,j}$ , 349 one for each  $i \in [k], j \in [0, m+1]$ .

The vertex selection gadget  $S_{i,1}$  encodes in binary the vertex that is selected in the clique from  $V_i$ . In particular, for each pair  $s_{i,1}^{2l-1}$ ,  $s_{i,1}^{2l}$ ,  $l \in [\log n]$  either of these vertices can take the maximum color in an optimal Grundy coloring of the binomial tree  $T_{2l}$  (that is, a coloring that gives the root of the binomial tree  $T_{2l}$  color 2l). A selection corresponds to bit 0 or 1 for the  $l^{th}$  binary position. In order to ensure that for each  $j \in [m]$  all (middle)  $S_{i,j}$  encode the same vertex, we use propagators.

**Propagators**  $p_{i,j}$ . See Figure 2b. For  $i \in [k]$  and  $j \in [0, m]$ , a propagator  $p_{i,j}$  is a single vertex connected to all vertices of  $S_{i,j}^2 \cup S_{i,j+1}^1$ . To each  $p_{i,j}$ , we also add supports  $\{2 \log n+1, 2 \log n+2, 2 \log n+3\}$ . The propagators have target  $t = 2 \log n + 4$ .

Edge selection  $W_j$ . See Figure 2b. Let  $j = (v_{i,x}, v_{i',y}) \in E$ , where  $v_{i,x} \in V_i$  and



(a) Vertex Selection gadget  $S_{i,j}$ .



(b) Propagators  $p_{i,j}$  and Edge Selection gadget  $W_j$ . The edge selection checkers and the supports of the  $p_{i,j}$  and  $s_{i,j}^l$  are not depicted. In the example  $B_x = 010$  and  $B_y = 100$ .

Fig. 2: The gadgets. Figure 2a is an enlargement of Figure 2b between  $p_{i,j-1}$  and  $p_{i,j}$ .

362	$v_{i',y} \in V_{i'}$ . The gadget $W_j$ consists of four vertices $w_{j,x}, w_{j,y}, w'_{j,x}, w'_{j,y}$ .
363	We call $w'_{j,x}, w'_{j,y}$ the edge selection checkers. We have the edges $(w'_{j,x}, w'_{j,y})$
364	$(w_{j,y}), (w_{j,x}', w_{j,x}), (w_{j,y}', w_{j,y})$ . Let us now describe the connections of these
365	vertices with the rest of the graph. Let $B_x = b_1 b_2 \dots b_{\log n}$ be the binary
366	representation of x. We connect $w_{j,x}$ to each vertex $s_{ij}^{2l-b_l}$ , $l \in [\log n]$ (we
367	do similarly for $w_{j,y}, S_{i',j}$ , and $B_y$ ). We add to each of $w_{j,x}, w_{j,y}$ supports
368	$\bigcup_{l \in [\log n+1]} \{2l-1\}$ . We add to each of $w'_{j,x}, w'_{j,y}$ supports $[2\log n+3] \setminus$
369	$\{2\log n + 1\}$ and set the target $t = 2\log n + 4$ for these two vertices. We
370	construct m such gadgets, one for each edge. We say that $W_j$ is activated if
371	at least one of $w_{j,x}, w_{j,y}$ receives color $2 \log n + 3$ .

- **Edge validators**  $q_{i,i'}$ . We construct  $\binom{k}{2}$  of these gadgets, one for each pair  $(i, i'), i < i' \in [k]$ . The edge validator is a single vertex that is connected to all vertices  $w_{j,x}$  for which j is an edge between  $V_i$  and  $V_{i'}$ . We add supports  $[2 \log n + 2]$  and a target of  $t = 2 \log n + 4$ .
- The edge validator plays the role of an "or" gadget: in order for it to achieve its target, at least one of its neighboring edge selection gadgets should be activated.
- LEMMA 3.6. G has a clique of size k if and only if G' has a target-achieving Grundy coloring.
- <sup>381</sup> *Proof.*  $\Rightarrow$ ) Suppose that *G* has a clique and we want to produce a coloring of *G'*. <sup>382</sup> In the remainder, when we say that we color a support tree "optimally", we mean <sup>383</sup> that we color its internal vertices in a way that gives the root the maximum possible <sup>384</sup> color.
- We color the vertices of G' in the following order: First, we color the vertex selection gadget  $S_{i,j}$ . We start from the supports which we color optimally. We then color the matchings as follows: let  $v_{i,x}$  be the vertex that was selected in the clique from  $V_i$  and  $b_1b_2 \dots b_{\log n}$  be the binary representation of x; we color vertices  $s_{i,j}^{2l-(1-b_l)}$ ,  $l \in [\log n]$  with color 2l - 1 and vertices  $s_{i,j}^{2l-b_l}$ ,  $l \in [\log n]$  will receive

color 2*l*. For the propagators, we color their supports optimally. Propagators have  $2 \log n + 3$  neighbors each, all with different colors, so they receive color  $2 \log n + 4$ , thus achieving the targets.

Then, we color the edge validators  $q_{i,i'}$  and the edge selection gadgets  $W_i$  that 393 correspond to edges of the clique (that is,  $j = (v_{i,x}, v_{i',y}) \in E$  and  $v_{i,x} \in V_i, v_{i',y} \in V_{i'}$ 394 are selected in the clique). We first color the supports of  $q_{i,i'}, w_{j,x}, w_{j,y}$  optimally. From the construction, vertex  $w_{j,x}$  is connected with vertices  $s_{i,j}^{2l-b_l}$  which have already 395 396 been colored  $2l, l \in [\log n]$  and with supports  $\bigcup_{l \in [\log n+1]} \{2l-1\}$ , thus  $w_{j,x}$  will receive 397 color  $2 \log n + 2$ . Similarly  $w_{j,y}$  already has neighbors which are colored  $[2 \log n + 1]$ , but 398 also  $w_{i,x}$ , thus it will receive color  $2 \log n + 3$ . These  $W_i$  will be activated. Since both 399  $w_{j,x}, w_{j,y}$  connect to  $q_{i,i'}$ , the latter will be assigned color  $2\log n + 4$ , thus achieving 400 its target. As for  $w'_{j,x}$  and  $w'_{j,y}$ , these vertices have one neighbor colored c, where  $c = 2 \log n + 2$  or  $c = 2 \log n + 3$ . We color their support  $T_c$  sub-optimally so that the 401 402 403 root receives color  $2\log n + 1$ ; we color their remaining supports optimally. This way, vertices  $w'_{j,x}, w'_{j,y}$  can be assigned color  $t = 2 \log n + 4$ , achieving the target. 404

Finally, for the remaining  $W_j$ , we claim that we can assign to both  $w_{j,x}, w_{j,y}$  a 405color that is at least as high as  $2\log n + 1$ . Indeed, we assign to each supporting 406tree  $T_r$  of  $w_{i,x}$  a coloring that gives its root the maximum color that is  $\leq r$  and does 407not appear in any neighbor of  $w_{j,x}$  in the vertex selection gadget. We claim that in 408this case  $w_{j,x}$  will have neighbors with all colors in  $[2 \log n]$ , because in every interval 409 [2l-1, 2l] for  $l \in [\log n]$ ,  $w_{j,x}$  has a neighbor with a color in that interval and a support 410 tree  $T_{2l+1}$ . If  $w_{j,x}$  has color  $2\log n + 1$  then we color the supports of  $w'_{j,x}$  optimally 411 and achieve its target, while if  $w_{j,x}$  has color higher than  $2\log n + 1$ , we achieve the 412target of  $w'_{i,x}$  as in the previous paragraph. 413

414  $\Leftarrow$ ) Suppose that G' admits a coloring that achieves the target for all propagators, 415 edge selection checkers, and edge validators. We will prove the following three claims, 416 which together imply the remaining direction of the lemma:

417 CLAIM 3.7. The coloring of the vertex selection gadgets is consistent throughout, 418 that is, for each  $i \in [k]$  and for each  $j_1, j_2, l$ , we have that  $s_{i,j_1}^l, s_{i,j_2}^l$  received the same 419 color. This coloring corresponds to a selection of k vertices of G.

420 CLAIM 3.8.  $\binom{k}{2}$  edge selection gadgets have been activated. They correspond to 421  $\binom{k}{2}$  edges of G being selected.

422 CLAIM 3.9. If an edge selection gadget  $W_j = \{w_{j,x}, w_{j,y}\}$  with  $j = (v_{i,x}, v_{i',y})$  has 423 been activated then the coloring of the vertex selection gadgets  $S_{i,j}$  and  $S_{i',j}$  corre-424 sponds to the selection of vertices  $v_{i,x}$  and  $v_{i',y}$ . In other words, selected vertices and 425 edges form a clique of size k in G.

Proof of Claim 3.7. Suppose that an edge selection checker  $w'_{i,x}$  achieved its tar-426 get. We claim that this implies that  $w_{j,x}$  has color at least  $2\log n + 1$ . Indeed,  $w'_{j,x}$ 427 has degree  $2 \log n + 3$ , so its neighbors must have all distinct colors in  $[2 \log n + 3]$ , but 428 among the supports there are only 2 neighbors which may have colors in  $2\log n + 1$ 429  $1, 2 \log n + 3$ ]. Therefore, the missing color must come from  $w_{j,x}$ . We now observe 430431 that vertices from the vertex selection gadgets have color at most  $2 \log n$ , because if we exclude from their neighbors the vertices  $w_{j,x}$  (which we argued have color at least 432433  $2\log n + 1$ ) and the propagators (which have target  $2\log n + 4$ ), these vertices have degree at most  $2\log n - 1$ . 434

Suppose that a propagator  $p_{i,j}$  achieves its target of  $2 \log n + 4$ . Since this vertex has a degree of  $2 \log n + 3$ , that means that all of its neighbors should receive all the colors in  $[2 \log n + 3]$ . As argued, colors  $[2 \log n + 1, 2 \log n + 3]$  must come from the supports. Therefore, the colors  $[2 \log n]$  come from the neighbors of  $p_{i,j}$  in the vertex selection gadgets.

We now note that, because of the degrees of vertices in vertex selection gadgets, only vertices  $s_{i,j}^{2\log n}$ ,  $s_{i,j+1}^{2\log n-1}$  can receive colors  $2\log n$ ,  $2\log n - 1$ ; from the rest, only  $s_{i,j}^{2\log n-2}$ ,  $s_{i,j+1}^{2\log n-3}$  can receive colors  $2\log n - 2$ ,  $2\log n - 3$  etc. Thus, for each  $l \in$ [log n], if  $s_{i,j}^{2l}$  receives color 2l - 1 then  $s_{i,j+1}^{2l-1}$  should receive color 2l and vice versa. With similar reasoning, in all vertex selection gadgets we have that  $s_{i,j}^{2l-1}$ ,  $s_{i,j}^{2l}$  received the two colors  $\{2l - 1, 2l\}$  since they are neighbors. As a result, the colors of  $s_{i,j+1}^{2l-1}$ ,  $s_{i,j}^{2l-1}$  (and thus the colors of  $s_{i,j+1}^{2l}$ ,  $s_{i,j}^{2l}$ ) are the same, therefore, the coloring is consistent, for all values of  $j \in [m]$ .

448 Proof of Claim 3.8. If an edge validator achieves its target of  $2 \log n + 4$ , then at 449 least one of its neighbors from an edge selection gadget has received color  $2 \log n + 3$ . 450 We know that each edge selection gadget only connects to a unique edge validator, so 451 there should be  $\binom{k}{2}$  edge selection gadgets which have been activated in order for all 452 edge validators to achieve the target.

*Proof of Claim 3.9.* Suppose that an edge validator  $q_{i,i'}$  achieves its target. That 453means that there exists an edge selection gadget  $W_j = \{w_{j,x}, w_{j,y}, w'_{j,x}, w'_{j,y}\}$  for which 454at least one of its vertices  $\{w_{j,x}, w_{j,y}\}$ , say vertex  $w_{j,x}$ , has received color  $2 \log n + 3$ . 455Let j be an edge connecting  $v_{i,x} \in V_i$  to  $v_{i',y} \in V_{i'}$ . Since the degree of  $w_{j,x}$  is 456 $2\log n + 4$  and we have already assumed that two of its neighbors  $(q_{i,i'})$  and  $w'_{i,x}$ 457have color  $2\log n + 4$ , in order for it to receive color  $2\log n + 3$  all its other neighbors 458should receive all colors in  $[2 \log n + 2]$ . The only possible assignment is to give colors 459 $2l, l \in [\log n]$  to its neighbors from  $S_{i,j}$  and color  $2\log n + 2$  to  $w_{j,y}$ . The latter is, in 460 turn, only possible if the neighbors of  $w_{j,y}$  from  $S_{i',j}$  receive all colors  $2l, l \in [\log n]$ . 461 The above corresponds to selecting vertex  $v_{i,x}$  from  $V_i$  and  $v_{i',y}$  from  $V_{i'}$ . 462П

LEMMA 3.10. Let G'' be the graph that results from G' if we remove all the treesupports. Then G'' has pathwidth at most  $\binom{k}{2} + 2k + 3$ .

*Proof.* We will use the equivalent definition of pathwidth as a node-searching 465game, where the robber is eager and invisible and the cops are placed on nodes [14]. 466 We will use  $\binom{k}{2} + 2k + 4$  cops to clean G'' as follows: We place  $\binom{k}{2}$  cops on the edge 467validators. Then, starting from j = 0, we place 2k cops on the propagators  $p_{i,0}, p_{i,1}$ 468 for  $i = 1, \ldots, k$ , plus 2 cops on the edge selection vertices  $w_{i,x}, w_{i,y}$  that correspond 469to edge j. We use the two additional cops to clean line by line the gadgets  $S_{i,j}$ . We 470 then use one of these cops to clear  $w'_{j,x}, w'_{j,y}$ . We continue then to the next column 471 j = 2 by removing the k cops from the propagators  $p_{i,1}$  and placing them to  $p_{i,3}$ . We 472 continue for  $j = 3, \ldots m - 1$  until the whole graph has been cleaned. 473

474 We will now show how to implement the targets using the tree-filling operation 475 defined below.

476 DEFINITION 3.11 (Tree-filling). Let G = (V, E) be a graph. Suppose that  $S = \{s_1, s_2, \ldots, s_j\} \subset V$  is a set of vertices with target t. The tree-filling operation is the 478 following. First, we add in G a binomial tree  $T_i$ , where  $i = \lceil \log j \rceil + t + 1$ . Observe 479 that, by Proposition 3.2, there exist  $2^{i-t-1} > j$  vertex-disjoint and non-adjacent sub-480 trees  $T_t$  in  $T_i$ . For each  $s \in S$ , we find such a copy of  $T_t$  in  $T_i$ , identify s with its root 481  $r_t$ , and delete all other vertices of the sub-tree  $T_t$ .

The tree-filling operation might in general increase treewidth, but we will do it in a way such that treewidth only increases by a constant factor compared to the 484 pathwidth of G.

485 LEMMA 3.12. Let G = (V, E) be a graph of pathwidth w and  $S = \{s_1, \ldots, s_j\} \subset V$ 486 a subset of vertices having target t. Then there is a way to apply the tree-filling 487 operation such that the resulting graph H has  $tw(H) \leq 4w + 5$ .

488 Proof. Construction of H. Let  $(\mathcal{P}, \mathcal{B})$  be a path-decomposition of G whose 489 largest bag has size w + 1 and  $B_1, B_2, \ldots, B_j \in \mathcal{B}$  distinct bags where  $\forall a, s_a \in B_a$ 490 (assigning a distinct bag to each  $s_a$  is always possible, as we can duplicate bags if 491 necessary). We call those bags *important*. We define an ordering  $o: S \to \mathbb{N}$  of the 492 vertices of S that follows the order of the important bags from left to right, that 493 is  $o(s_a) < o(s_b)$  if  $B_a$  is on the left of  $B_b$  in  $\mathcal{P}$ . For simplicity, let us assume that 494  $o(s_a) = a$  and that  $B_a$  is to the left of  $B_b$  if a < b.

We describe a recursive way to do the substitution of the trees in the tree-filling operation. Crucially, when j > 2 we will have to select an appropriate mapping between the vertices of S and the disjoint subtrees  $T_t$  in the added binomial tree  $T_i$ , so that we will be able to keep the treewidth of the new graph bounded.

- If j = 1 then i = t + 1. We add to the graph a copy of  $T_i$ , arbitrarily select the root of a copy of  $T_t$  contained in  $T_i$ , and perform the tree-filling operation as described.
- Suppose that we know how to perform the substitution for sets of size at most 503  $\lceil j/2 \rceil$ , we will describe the substitution process for a set of size j. We have 504  $i = \lceil \log j \rceil + t + 1$  and for all j we have  $\lceil \log \lceil j/2 \rceil \rceil = \lceil \log j \rceil - 1$ . Split the 505 set S into two (almost) equal disjoint sets  $S^L$  and  $S^R$  of size at most  $\lceil j/2 \rceil$ , 506 where for all  $s_a \in S^L$  and for all  $s_b \in S^R$ , a < b. We perform the tree-filling 507 on each of these sets by constructing two binomial trees  $T_{i-1}^L$ ,  $T_{i-1}^R$  and doing 508 the substitution; then, we connect their roots and set the root of the left tree 509 as the root  $r_i$  of  $T_i$ , thus creating the substitution of a tree  $T_i$ .

**Small treewidth.** We now prove that the new graph H that results from applying the tree-filling operation on G and S as described above has a tree decomposition  $(\mathcal{T}, \mathcal{B}')$  of width 4w + 5; in fact we prove by induction on j a stronger statement: if  $A, Z \in \mathcal{B}$  are the left-most and right-most bags of  $\mathcal{P}$ , then there exists a tree decomposition  $(\mathcal{T}, \mathcal{B}')$  of H of width 4w + 5 with the added property that there exists  $R \in \mathcal{B}'$  such that  $A \cup Z \cup \{r_i\} \subset R$ , where  $r_i$  is the root of the tree  $T_i$ .

For the base case, if j = 1 we have added to our graph a  $T_i$  of which we have 516selected an arbitrary sub-tree  $T_t$ , and identified the root  $r_t$  of  $T_t$  with the unique 517vertex of S that has a target. Take the path decomposition  $(\mathcal{P}, \mathcal{B})$  of the initial graph 518and add all vertices of A (its first bag) and the vertex  $r_i$  (the root of  $T_i$ ) to all bags. Take an optimal tree decomposition of  $T_i$  of width 1 and add  $r_i$  to each bag, obtaining 520 521 a decomposition of width 2. We add an edge between the bag of  $\mathcal{P}$  that contains the unique vertex of S, and a bag of the decomposition of  $T_i$  that contains the selected  $r_t$ . We now have a tree decomposition of the new graph of width 2w + 2 < 4w + 5. 523 Observe that the last bag of  $\mathcal{P}$  now contains all of A, Z and  $r_i$ . 524

For the inductive step, suppose we applied the tree-filling operation for a set Sof size j > 1. Furthermore, suppose we know how to construct a tree decomposition with the desired properties (width 4w + 5, one bag contains the first and last bags of the path decomposition  $\mathcal{P}$  and  $r_i$ ), if we apply the tree-filling operation on a target set of size at most j-1. We show how to obtain a tree decomposition with the desired properties if the target set has size j.

By construction, we have split the set S into two sets  $S^L, S^R$  and have applied the tree-filling operation to each set separately. Then, we connected the roots of the

two added trees to obtain a larger binomial tree. Observe that for |S| = j > 1 we 533 have  $|S^{L}|, |S^{R}| < j$ . 534

Let us first cut  $\mathcal{P}$  in two parts, in such a way that the important bags of  $S^L$ are on the left and the important bags of  $S^R$  are on the right. We call  $A^L = A$  and 536 $Z^L$  the leftmost and rightmost bags of the left part and  $A^R$ ,  $Z^R = Z$  the leftmost 537 and rightmost bags of the right part. We define as  $G^L$  (respectively  $G^R$ ) the graph 538 that contains all the vertices of the left (respectively right) part. Let  $r_i$  be the root of  $T_i$  and  $r_{i-1}$  the root of its subtree  $T_{i-1}$ . From the inductive hypothesis, we can construct tree decompositions  $(\mathcal{T}^{\mathcal{L}}, \mathcal{B}^{\mathcal{L}}), (\mathcal{T}^{\mathcal{R}}, \mathcal{B}^{\mathcal{R}})$  of width 4w + 5 for the graphs  $H^L$ ,  $H^R$  that occur after applying tree-filling on  $G^L, S^L$  and  $G^R, S^R$ ; furthermore, there 540541542exist  $R^L \in \mathcal{B}^{\mathcal{L}}, R^R \in \mathcal{B}^{\mathcal{R}}$  such that  $R^L \supseteq A \cup Z^L \cup \{r_i\}$  and  $R^R \supseteq A^R \cup Z \cup \{r_{i-1}\}$ . 543We construct a new bag  $R' = A \cup \overline{A^R} \cup Z^L \cup Z \cup \{r_{i-1}, r_i\}$ , and we connect R'544 to both  $R^L$  and  $R^R$ , thus combining the two tree-decompositions into one. Last we 545

create a bag  $R = A \cup Z \cup \{r_i\}$  and attach it to R'. This completes the construction 546of  $(\mathcal{T}, \mathcal{B}')$ . 547

Observe that  $(\mathcal{T}, \mathcal{B}')$  is a valid tree-decomposition for H: 548

- 549
- $V(H) = V(H^L) \cup V(H^R)$ , thus  $\forall v \in V(H), v \in \mathcal{B}^L \cup \mathcal{B}^R \subset \mathcal{B}$ .  $E(H) = E(H^L) \cup E(H^R) \cup \{(r_{i-1}, r_i)\}$ . We have that  $r_{i-1}, r_i \in R' \in \mathcal{B}$ . All 550other edges were dealt with in  $\mathcal{T}^{\mathcal{L}}, \mathcal{T}^{\mathcal{R}}$ .
- Each vertex  $v \in V(H)$  that belongs in exactly one of  $H^L, H^R$  trivially satisfied the connectivity requirement: bags that contain v are either fully contained in  $\mathcal{T}^{\mathcal{L}}$  or  $\mathcal{T}^{\mathcal{R}}$ . A vertex v that is in both  $H^L$  and  $H^R$  is also in  $Z^L \cap A^R$  due to 554the properties of path-decompositions, hence in R'. Therefore, the sub-trees of bags that contain v in  $\mathcal{T}^{\mathcal{L}}, \mathcal{T}^{\mathcal{R}}$ , form a connected sub-tree in  $\mathcal{T}$ . 556
- The width of  $\mathcal{T}$  is max{ $tw(H^L), tw(H^R), |R'| 1$ } = 4w + 5. 557

The last thing that remains to do in order to complete the proof is to show the 558 equivalence between achieving the targets and finding a Grundy coloring.

LEMMA 3.13. Let G and G' be two graphs as described in Lemma 3.6 and let H 560 be constructed from G' by using the tree-filling operation. Then G has a clique of size k if and only if  $\Gamma(H) \geq \lceil \log(k(m+1) + {k \choose 2} + 2m) \rceil + 2\log n + 5$ . Furthermore, 561562 $tw(H) \le 4\binom{k}{2} + 8k + 17.$ 563

*Proof.* We note that the number of vertices with targets in our construction is 564 $m' = k(m+1) + {k \choose 2} + 2m$  (the propagators, edge selection checkers, and edge-checkers). 565From Lemma 3.6, it only suffices to show that  $\Gamma(H) \geq \lceil \log m' \rceil + 2 \log n + 5$  if and 566 only if the vertices with targets achieve color  $t = 2 \log n + 4$ . 567

For the forward direction, once vertices with targets get the desirable colors, the 568 rest of the binomial tree of the tree-filling operation can be colored optimally, starting 569from its leaves all the way up to its roots, which will get color  $i = \lfloor \log m' \rfloor + 2 \log n + 5$ . 570

For the converse direction, observe that the only vertices having degree higher than  $2\log n + 4$  are the edge-checkers and the vertices of the binomial tree  $H \setminus G'$ . 572However, the edge-checkers connect to only one vertex of degree higher than  $2 \log n + 4$ , that in the binomial tree. Thus no vertex of G' can ever get a color higher than 574 $2\log n + 6$  and the only way that  $\Gamma(H) \geq \lceil \log m' \rceil + 2\log n + 5$  is if the root of the 575576 binomial tree of the tree-filling operation (the only vertex of high enough degree) receives color  $\lceil \log m' \rceil + 2 \log n + 5$ . For that to happen, all the support-trees of this tree should be colored optimally, which proves that the vertices with targets  $2 \log n + 4$ 578 having substituted support trees  $T_{2\log n+4}$  should achieve their targets. 579

In terms of the treewidth of H we have the following: Lemma 3.10 says that 580

G' once we remove all the supporting trees has pathwidth at most  $\binom{k}{2} + 2k + 3$ . 581 Applying Lemma 3.12 we get that H where we have ignored the tree-supports from 582G' has treewidth at most  $4\left(\binom{k}{2}+2k+3\right)+5$ . Adding back the tree-supports does 583

not increase its treewidth. 584

The main theorem of this section now immediately follows. 585

586 THEOREM 3.14. GRUNDY COLORING parameterized by treewidth is W[1]-hard.

4. FPT for pathwidth. In this section, we show that, in contrast to treewidth, 587 GRUNDY COLORING is FPT parameterized by pathwidth. This is achieved by a 588 combination of an algorithm for GRUNDY COLORING given by Telle and Proskurowski 589590and a combinatorial bound due to Dujmovic, Joret, and Wood. We first recall these results below. 591

LEMMA 4.1 ([27]). For every graph G,  $\Gamma(G) \leq 8 \cdot (pw(G) + 1)$ . 592

LEMMA 4.2 ([84]). There is an algorithm which solves GRUNDY COLORING in time  $O^*(2^{O(tw(G) \cdot \Gamma(G))}).$ 594

595 We thus get the following result.

THEOREM 4.3. GRUNDY COLORING can be solved in time  $O^*(2^{O(pw(G)^2)})$ . 596

*Proof.* Since in all graphs  $tw(G) \leq pw(G)$  and by Lemma 4.1  $\Gamma(G) \leq 8(pw(G) +$ 5971), we have  $tw(G) \cdot \Gamma(G) = O(pw(G)^2)$  and the algorithm of [84] runs in at most the 598stated time. Г 599

5. NP-hardness for Constant Clique-width. In this section we prove that 600 GRUNDY COLORING is NP-hard even for constant clique-width via a reduction from 601 3-SAT. We use a similar idea of adding supports as in Section 3, but supports now 602 will be cliques instead of binomial trees. The support operation is defined as: 603

DEFINITION 5.1. Given a graph G = (V, E), a vertex  $u \in V$  and a set of positive 604 605 integers S, we define the **support** operation as follows: for each  $i \in S$ , we add to G a clique of size i (using new vertices) and we connect one arbitrary vertex of each such 606 clique to u. 607

When applying the support operation we will say that we support vertex u with 608 set S and we will call the vertices introduced supporting vertices. Intuitively, the 609 support operation ensures that the vertex u may have at least one neighbor with 610 color i for each  $i \in S$ . 611

We are now ready to describe our construction. Suppose we are given a 3CNF 612 formula  $\phi$  with n variables  $x_1, \ldots, x_n$  and m clauses  $c_1, \ldots, c_m$ . We assume without 613 loss of generality that each clause contains exactly three variables. We construct a 614 graph  $G(\phi)$  as follows: 615

616

1. For each  $i \in [n]$  we construct two vertices  $x_i^P, x_i^N$  and the edge  $(x_i^P, x_i^N)$ . 2. For each  $i \in [n]$  we support the vertices  $x_i^P, x_i^N$  with the set [2i-2]. (Note 617 that  $x_1^P, x_1^N$  have empty support). 618

- 3. For each  $i \in [n], j \in [m]$ , if variable  $x_i$  appears in clause  $c_j$  then we construct 619 a vertex  $x_{i,j}$ . Furthermore, if  $x_i$  appears positive in  $c_j$ , we connect  $x_{i,j}$  to  $x_{i'}^P$ 620 for all  $i' \in [n]$ ; otherwise we connect  $x_{i,j}$  to  $x_{i'}^N$  for all  $i' \in [n]$ . 621
- 4. For each  $i \in [n], j \in [m]$  for which we constructed a vertex  $x_{i,j}$  in the previous 622 step, we support that vertex with the set  $(\{2k \mid k \in [n]\} \cup \{2i-1, 2n+1, 2n+1\})$ 623  $2\}) \setminus \{2i\}.$ 624

5. For each  $j \in [m]$  we construct a vertex  $c_j$  and connect to all (three) vertices  $x_{i,j}$  already constructed. We support the vertex  $c_j$  with the set [2n].

627 6. For each  $j \in [m]$  we construct a vertex  $d_j$  and connect it to  $c_j$ . We support 628  $d_j$  with the set  $[2n+3] \cup [2n+5, 2n+3+j]$ .

629 630 7. We construct a vertex u and connect it to  $d_j$  for all  $j \in [m]$ . We support u with the set  $[2n+4] \cup [2n+5+m, 10n+10m]$ .

This completes the construction. Before we proceed, let us give some intuition. 631 Observe that we have constructed two vertices  $x_i^P, x_i^N$  for each variable. The support 632 of these vertices and the fact that they are adjacent, allow us to give them colors 633  $\{2i-1,2i\}$ . The choice of which gets the higher color encodes an assignment to 634 variable  $x_i$ . The vertices  $x_{i,j}$  are now supported in such a way that they can "ignore" 635 636 the values of all variables except  $x_i$ ; for  $x_i$ , however,  $x_{i,j}$  "prefers" to be connected to a vertex with color 2i (since 2i - 1 appears in the support of  $x_{i,j}$ , but 2i does 637 not). Now, the idea is that  $c_j$  will be able to get color 2n + 4 if and only if one of 638 its literal vertices  $x_{i,i}$  was "satisfied" (has a neighbor with color 2*i*). The rest of the 639 construction checks if all clause vertices are satisfied in this way. 640

641 We now state the lemmata that certify the correctness of our reduction.

642 LEMMA 5.2. If  $\phi$  is satisfiable then  $G(\phi)$  has a Grundy coloring with 10n+10m+1643 colors.

*Proof.* Consider a satisfying assignment of  $\phi$ . We first produce a coloring of the 644vertices  $x_i^P, x_i^N$  as follows: if  $x_i$  is set to True, then  $x_i^P$  is colored 2i and  $x_i^N$  is colored 2i - 1; otherwise  $x_i^P$  is colored 2i - 1 and  $x_i^N$  is colored 2i. Before proceeding, let us also color the supporting vertices of  $x_i^P, x_i^N$ : each such vertex belongs to a clique 645 646 647 which contains only one vertex with a neighbor outside the clique. For each such 648 clique of size  $\ell$ , we color all vertices of the clique which have no outside neighbors 649 with colors from  $[\ell - 1]$  and use color  $\ell$  for the remaining vertex. Note that the 650 coloring we have produced so far is a valid Grundy coloring, since each vertex  $x_i^P, x_i^N$ 651 has for each  $c \in [2i-2]$  a neighbor with color c among its supporting vertices, allowing us to use colors  $\{2i-1, 2i\}$  for  $x_i^P, x_i^N$ . In the remainder, we will use similar such 652 653 colorings for all supporting cliques. We will only stress the color given to the vertex 654 of the clique that has an outside neighbor, respecting the condition that this color 655is not larger than the size of the clique. Note that it is not a problem if this color 656 is strictly smaller than the size of the clique, as we are free to give higher colors to 657 internal vertices. 658

Consider now a clause  $c_j$  for some  $j \in [m]$ . Suppose that this clause contains the three variables  $x_{i_1}, x_{i_2}, x_{i_3}$ . Because we started with a satisfying assignment, at least one of these variables has a value that satisfies the clause, without loss of generality  $x_{i_3}$ . We therefore color  $x_{i_1}, x_{i_2}, x_{i_3}$  with colors 2n + 1, 2n + 2, 2n + 3 respectively and we color  $c_j$  with color 2n + 4. We now need to show that we can appropriately color the supporting vertices to make this a valid Grundy coloring.

Recall that the vertex  $x_{i_3}$  has support  $\{2, 4, ..., 2n\} \setminus \{2i_3\} \cup \{2i_3-1, 2n+1, 2n+2\}$ . 665For each  $i' \neq i_3$  we observe that  $x_{i_3}$  is connected to a vertex (either  $x_{i_3}^P$  or  $x_{i_3}^N$ ) which 666 has a color in  $\{2i' - 1, 2i'\}$ , we are therefore missing the other color from this set. 667 We consider the clique of size 2i' supporting  $x_{i_3,j}$ : we assign this missing color to the 668 669 vertex of this clique that is adjacent to  $x_{i_3,j}$ . Note that the clique is large enough to color its remaining vertices with lower colors in order to make this a valid Grundy 670 coloring. For  $i_3$ , we observe that, since  $x_{i_3}$  satisfies the clause, the vertex  $x_{i_3,j}$  has a 671 neighbor (either  $x_{i_3}^P$  or  $x_{i_3}^N$ ) which has received color  $2i_3$ ; we use color  $2i_3 - 1$  in the 672 support clique of the same size. Similarly, we use colors 2n + 1, 2n + 2 in the support 673

cliques of the same sizes, and  $x_{i_3}$  has neighbors with colors covering all of [2n+2].

675For the vertex  $x_{i_2,j}$  we proceed in a similar way. For  $i' < i_2$  we give the support vertex from the clique of size 2i' the color from  $\{2i' - 1, 2i'\}$  which does not already 676 appear in the neighborhood of  $x_{i_2,j}$ . For  $i' \in [i_2, n-1]$  we take the vertex from the 677 clique of size 2i' + 2 and give it the color of  $\{2i' - 1, 2i'\}$  which does not yet appear in 678 the neighborhood of  $x_{i_2,j}$ . In this way we cover all colors in [2n-2]. We now observe 679 that  $x_{i_{2},j}$  has a neighbor with color in  $\{2n-1,2n\}$  (either  $x_n^P$  or  $x_n^N$ ); together with 680 the support vertices from the cliques of sizes 2n + 1, 2n + 2 this allows us to cover 681 the colors [2n-1, 2n+1]. We use a similar procedure to cover the colors [2n] in 682 the neighborhood of  $x_{i_1,j}$ . Now, the 2n support vertices in the neighborhood of  $c_j$ , 683 together with  $x_{i_1,j}, x_{i_2,j}, x_{i_3,j}$  allow us to give that vertex color 2n + 4. 684

We now give each vertex  $d_j$ , for  $j \in [m]$  color 2n + j + 4. This can be extended to a valid coloring, because  $d_j$  is adjacent to  $c_j$ , which has color 2n + 4, and the support of  $d_j$  is  $[2n + j + 3] \setminus \{2n + 4\}$ .

Finally, we give u color 10n+10m+1. Its support is  $[10n+10m] \setminus [2n+5, 2n+m+4]$ . However, u is adjacent to all vertices  $d_j$ , whose colors cover the set  $\{2n+4+j \mid j \in [m]\}$ .

691 LEMMA 5.3. If  $G(\phi)$  has a Grundy coloring with 10n + 10m + 1 colors, then  $\phi$  is 692 satisfiable.

*Proof.* Consider a Grundy coloring of  $G(\phi)$ . We first assume without loss of 693 generality that we consider a minimal induced subgraph of G for which the coloring 694 695 remains valid, that is, deleting any vertex will either reduce the number of colors or invalidate the coloring. In particular, this means there is a unique vertex with color 696 10n + 10m + 1. This vertex must have degree at least 10n + 10m. However, there are 697 only two such vertices in our graph: u and its support neighbor vertex in the clique of 698 size 10n + 10m. If the latter vertex has color 10n + 10m + 1, we can infer that u has 699 color 10n + 10m: this color cannot appear in the clique because all its internal vertices 700 701 have degree 10n + 10m - 1, and one of their neighbors has a higher color. We observe now that exchanging the colors of u and its neighbor produces another valid coloring. 702 We therefore assume without loss of generality that u has color 10n + 10m + 1. 703

We now observe that in each supporting clique of u of size i the maximum color used is i (since u has the largest color in the graph). Similarly, the largest color that can be assigned to  $d_j$  is 2n + j + 4, because  $d_j$  has degree 2n + j + 4, but one of its neighbors (u) has a higher color. We conclude that the only way for the 10n + 10mneighbors of u to cover all colors in [10n + 10m] is for each support clique of size i to use color i and for each  $d_j$  to be given color 2n + j + 4.

Suppose now that  $d_j$  was given color 2n + j + 4. This implies that the largest color that  $c_j$  may have received is 2n + 4, since its degree is 2n + 4, but  $d_j$  received a higher color. We conclude again that for the neighbors of  $d_j$  to cover [2n + j + 3] it must be the case that each supporting clique used its maximum possible color and  $c_j$ received color 2n + 4.

Suppose now that a vertex  $c_j$  received color 2n + 4. Since  $d_j$  received a higher color, the remaining 2n + 3 neighbors of this vertex must cover [2n + 3]. In particular, since the support vertices have colors in [2n], its three remaining neighbors, say  $x_{i_1,j}, x_{i_2,j}, x_{i_3,j}$  must have colors covering [2n + 1, 2n + 3]. Therefore, all vertices  $x_{i,j}$ have colors in [2n + 1, 2n + 3].

Consider now two vertices  $x_i^P, x_i^N$ , for some  $i \in [n]$ . We claim that the vertex which among these two has the lower color, has color at most 2i - 1. To see this observe that this vertex may have at most 2i - 2 neighbors from the support vertices

that have lower colors and these must use colors in [2i-2] because of their degrees. Its neighbors of the form  $x_{i,j}$  have color at least 2n + 1 > 2i - 1, and its neighbor in  $\{x_i^P, x_i^N\}$  has a higher color. Therefore, the smaller of the two colors used for  $\{x_i^P, x_i^N\}$  is at most 2i - 1 and by similar reasoning the higher of the two colors used for this set is at most 2i. We now obtain an assignment for  $\phi$  by setting  $x_i$  to True if  $x_i^P$  has a higher color than  $x_i^N$  and False otherwise (this is well-defined, since  $x_i^P, x_i^N$ )

are adjacent).

Let us argue why this is a satisfying assignment. Take a clause vertex  $c_j$ . As 730 argued, one of its neighbors, say  $x_{i_3,j}$  has color 2n+3. The degree of  $x_{i_3,j}$ , excluding 731  $c_i$  which has a higher color, is 2n + 2, meaning that its neighbors must exactly cover 732 [2n+2] with their colors. Since vertices  $x_i^P, x_i^N$  have color at most 2i, the colors 733 [2n+1, 2n+2] must come from the support cliques of the same sizes. Now, for each 734  $i \in [n]$  the vertex  $x_{i_3,j}$  has exactly two neighbors which may have received colors in 735 $\{2i-1,2i\}$ . This can be seen by induction on *i*: first, for i = n this is true, since we 736 only have the support clique of size 2n and the neighbor in  $\{x_n^P, x_n^N\}$ . Proceeding in 737 the same way we conclude the claim for smaller values of i. The key observation is 738 now that the clique of size  $2i_3 - 1$  cannot give us color  $2i_3$ , therefore this color must 739 come from  $\{x_{i_3}^N, x_{i_3}^P\}$ . If the neighbor of  $x_{i_3,j}$  in this set uses  $2i_3$ , this must be the 740 higher color in this set, meaning that  $x_{i_3}$  has a value that satisfies  $c_j$ . Π 741

## T42 LEMMA 5.4. The graph $G(\phi)$ has clique-width at most 8.

Lemma 5.4. Let us first observe that the support operation does not significantly 743 affect a graph's clique-width. Indeed, if we have a clique-width expression for  $G(\phi)$ 744 without the support vertices, we can add these vertices as follows: each time we 745 introduce a vertex that must be supported we instead construct the graph induced 746 by this vertex and its support and then rename all supporting vertices to a junk label 747 that is never connected to anything else. It is clear that this can be done by adding 748 at most three new labels: two labels for constructing the clique (that will form the 749 support gadget) and the junk label. In fact, below we give a clique-width expression 750for the rest of the graph that already uses a junk label (say, label 0), that is, a label on 751which we never apply a Join operation. Hence, it suffices to compute the clique-width 752 of  $G(\phi)$  without the support gadgets and then add 2. 753

Let us then argue why the rest of the graph has constant clique-width. First, the graph induced by  $x_i^N, x_i^P$ , for  $i \in [n]$  is a matching. We construct this graph using 4 labels, say 1, 2, 3, 4 as follows: for each  $i \in [n]$  we introduce  $x_i^N$  with label 3,  $x_i^P$  with label 4, perform a Join between labels 3 and 4, then Rename label 3 to 1 and label 4 to 2. This constructs the matching induced by these 2n vertices and also ensures that all vertices  $x_i^N$  have label 1 in the end and all vertices  $x_i^P$  have label 2 in the end.

We then introduce to the graph the clauses one by one. Specifically, for each 760  $j \in [m]$  we do the following: we introduce  $c_j$  with label 3,  $d_j$  with label 4, Join labels 761 3 and 4, Rename label 4 to label 5; then for each  $i \in [n]$  such that we have a vertex 762  $x_{i,i}$  we introduce that vertex with label 4, Join label 4 with label 3, and Join label 763 4 with label 1 or 2, depending on whether  $x_{i,j}$  is connected to vertices  $x_i^N$  or  $x_i^P$ , 764then Rename label 4 to the junk label 0. Once all  $x_{i,j}$  vertices for a fixed j have been 765 766 introduced we Rename label 3 to the junk label 0 and move to the next clause. Finally, we introduce u with label 3 and Join label 3 to label 5 (which is the label shared by 767 all  $d_i$  vertices). In the end we have used 6 labels, namely the labels  $\{0, 1, 2, 3, 4, 5\}$ 768 for  $G(\phi)$  without the support vertices, so the whole graph can be constructed with 8 769 770 labels. 

THEOREM 5.5. Given graph G = (V, E), k-GRUNDY COLORING is NP-hard even

## when the clique-width of the graph cw(G) is a fixed constant.

6. FPT for modular-width. In this section we show that GRUNDY COLORING 773 is FPT parameterized by modular-width. Recall that G = (V, E) has modular-width 774 775 w if V can be partitioned into at most w modules, such that each module is a singleton or induces a graph of modular-width w. Neighborhood diversity is the restricted 776 version of this measure where modules are required to be cliques or independent sets. 777 The first step is to show that GRUNDY COLORING is FPT parameterized by neigh-778 borhood diversity. Similarly to the standard COLORING algorithm for this parameter 779 [62], we observe that, without loss of generality, all modules can be assumed to be 780 cliques, and hence any color class has one of  $2^w$  possible types, depending on the 781 modules it intersects. We would like to use this to reduce the problem to an ILP with 782 783  $2^{w}$  variables, but unlike COLORING, the ordering of color classes matters. We thus prove that the optimal solution can be assumed to have a "canonical" structure where 784each color type only appears in consecutive colors. We then extend the neighborhood 785 diversity algorithm to modular-width using the idea that we can calculate the Grundy 786 number of each module separately, and then replace it with an appropriately-sized 787 clique. 788

**6.1. Neighborhood diversity.** Recall that two vertices  $u, v \in V$  of a graph G = (V, E) are twins if  $N(u) \setminus \{v\} = N(v) \setminus \{u\}$ , and they are called true (respectively, false) twins if they are adjacent (respectively, non-adjacent). A twin class is a maximal set of vertices that are pairwise twins. It is easy to see that any twin class is either a clique or an independent set. We say that a graph G = (V, E) has neighborhood diversity w if V can be partitioned into at most w twin classes.

Let G = (V, E) be a graph of neighborhood diversity w with a vertex partition  $V = W_1 \dot{\cup} \dots \dot{\cup} W_w$  into twin classes. It is obvious that in any Grundy Coloring of G, the vertices of a true twin class must have all distinct colors because they form a clique. Furthermore, it is not difficult to see that the vertices of a false twin class must be colored by the same color because all of their vertices have the same neighbors.

In fact, we can show that we can remove vertices from a false twin class without affecting the Grundy number of the graph:

EEMMA 6.1. Let G = (V, E) be a graph of neighborhood diversity w with a vertex partition  $V = W_1 \cup ... \cup W_w$  into twin classes. Let  $W_i$  be a false twin class having at least two distinct vertices  $u, v \in W_i$ . Then G - v has k-Grundy coloring if and only if G has.

806 *Proof.* The forward implication is trivial. To see the opposite direction, consider 807 an arbitrary k-Grundy coloring of G. The vertices u, v must have the same color, 808 since they have the same neighbors. Any vertex whose color is higher than v and is 809 adjacent with v must be to u as well. Since u and v have the same color, this implies 810 that the same coloring restricted to G - v is a k-Grundy coloring.

Using Lemma 6.1, we can reduce every false twin class into a singleton vertex, thus 811 from now on we may assume that every twin class is a clique (possibly a singleton). 812 813 An immediate consequence is that that any color class of a Grundy coloring can take at most one vertex from each twin class. Furthermore, the colors of any two vertices 814 815 from the same twin class are interchangeable. Therefore, a color class  $V_i$  of a Grundy coloring is precisely characterized by the set of twin classes  $W_i$  that  $V_i$  intersects. For 816 a color class  $V_i$ , we call the set  $\{j \in [w] : W_j \cap V_i \neq \emptyset\}$  as the *intersection pattern* of 817  $V_i$ . 818

Let  $\mathcal{I}$  be the collection of all sets  $I \subseteq [w]$  of indices such that  $W_i$  and  $W_j$  are non-

adjacent for every distinct pairs  $i, j \in [w]$ . It is clear that the intersection pattern of any color class is a member of  $\mathcal{I}$ . It turns out that if  $I \in \mathcal{I}$  appears as an intersection pattern for more than one color classes, then it can be assumed to appear on a consecutive set of colors.

LEMMA 6.2. Let G = (V, E) be a graph of neighborhood diversity w with a vertex partition  $V = W_1 \cup ... \cup W_w$  into true twin classes. Let  $V_1 \cup ... \cup V_k$  be a k-Grundy coloring of G and let  $I_i \in \mathcal{I}$  be the set of indices j such that  $V_i \cap W_j \neq \emptyset$  for each  $i \in [k]$ . If  $I_i = I_{i'}$  for some  $i' \ge i+2$ , then the coloring  $V'_1 \cup ... \cup V'_k$  where

$$V_{\ell}' = \begin{cases} V_{i'} & \text{if } \ell = i+1, \\ V_{\ell-1} & \text{if } i+1 < \ell \le i' \\ V_{\ell} & \text{otherwise} \end{cases}$$

828

(*i.e.* the coloring obtained by 'inserting'  $V_{i'}$  in between  $V_i$  and  $V_{i+1}$ ) is a Grundy coloring as well.

Proof. First observe that the new coloring remains a proper coloring, so we only need to argue that it's a valid Grundy coloring. Consider a vertex v which took color  $j \leq i$  in the original coloring. All its neighbors with color strictly smaller than j have retained their colors, so v is still properly colored. Suppose then that v had color j > i'in the original coloring. Then, v has a neighbor in each of the classes  $V_1, \ldots, V_{j-1}$ , which means that it has at least one neighbor in each of the sets  $V'_1, \ldots, V'_{j-1}$ , so it is still validly colored.

Suppose that v had received a color  $j \in [i + 1, i' - 1]$  in the original coloring and receives color j + 1 in the new coloring. We claim that for each j' < j + 1, v has a neighbor with color j'. Indeed, this is easy to see for  $j' \leq i$ , as these vertices retain their colors; for j' = i + 1 we observe that v has a neighbor with color i in the original coloring, and each such vertex has a true twin with color i + 1 in the new coloring; and for j' > i + 1, the neighbor of v which had color j' - 1 originally now has color j'. Finally, suppose that v had received color i' in the original coloring and receives

color i + 1 in the new coloring. We now observe that such a vertex v must have a true twin which received color i in both colorings, therefore coloring v with i + 1 is valid.

847 The following is a consequence of Lemma 6.2.

848 COROLLARY 6.3. Let G = (V, E) be a graph of neighborhood diversity w with a 849 vertex partition  $V = W_1 \cup ... \cup W_w$  into true twin classes. If G admits a k-Grundy 850 coloring, then there is a k-Grundy coloring  $V_1 \cup ... \cup V_k$  with the following property: 851 for each  $j_1, j_2 \in [k]$  such that  $V_{j_1}$  has a non-empty intersection with the same twin 852 classes as  $V_{j_2}$ , we have that for all  $j_3 \in [k]$  with  $j_1 \leq j_3 \leq j_2$ ,  $V_{j_3}$  also has non-empty 853 intersection with the same twin classes as  $V_{j_1}$ .

For a sub-collection  $\mathcal{I}'$  of  $\mathcal{I}$ , we say that  $\mathcal{I}'$  is *eligible* if there is an ordering  $\leq$  on  $\mathcal{I}'$  such that for every  $I, I' \in \mathcal{I}'$  with  $I \succeq I'$ , and for every  $i \in I$ , there exists  $i' \in I'$ such that the twin classes  $W_i$  and  $W_{i'}$  are adjacent, or i = i'. Clearly, a sub-collection of an eligible sub-collection of  $\mathcal{I}$  is again eligible. Intuitively, the ordering that shows that a sub-collection is eligible corresponds to a Grundy coloring where color classes have the corresponding intersection patterns.

Now we are ready to present an FPT algorithm, parameterized by the neighborhood diversity w, to compute the Grundy number. The algorithm consists of two steps: (i) guess a sub-collection  $\mathcal{I}'$  of  $\mathcal{I}$  which are used as intersection patterns by a Grundy coloring, and (ii) given  $\mathcal{I}'$ , we solve an integer linear program.

Let  $\mathcal{I}'$  be a sub-collection of  $\mathcal{I}$ . For each  $I \in \mathcal{I}'$ , let  $x_I$  be an integer variable 864 which is interpreted as the number of colors for which I appears as an intersection 865 pattern. Now, the linear integer program  $ILP(\mathcal{I}')$  for a sub-collection  $\mathcal{I}'$  is given as 866 the following: 867

 $\max \sum_{I \in \mathcal{I}'} x_I$ (6.1)868

870 (6.2) 
$$\sum_{I \in \mathcal{I}': i \in I} x_I = |W_i| \quad \forall i \in [w],$$

where each  $x_I$  takes a positive integer value. 871

LEMMA 6.4. Let G = (V, E) be a graph of neighborhood diversity w with a vertex 872 partition  $V = W_1 \cup \ldots \cup W_w$  into true twin classes. The maximum value of  $ILP(\mathcal{I}')$ 873 over all eligible  $\mathcal{I}' \subseteq \mathcal{I}$  equals the Grundy number of G. 874

Proof. We first prove that the maximum value over all considered ILPs is at least 875the Grundy number of G. Fix a Grundy coloring  $V_1 \cup \cdots \cup V_k$  achieving the Grundy 876 number while satisfying the condition of Corollary 6.3. Consider the sub-collection  $\mathcal{I}'$ 877 of  $\mathcal{I}$  used as intersection patterns in the fixed Grundy coloring. It is clear that  $\mathcal{I}'$  is 878 eligible, using the natural ordering of the color classes. Let  $\bar{x}_I$  be the number of colors 879 for which I is an intersection pattern for each  $I \in \mathcal{I}'$ . It is straightforward to check 880 that setting the variable  $x_I$  at value  $\bar{x}_I$  satisfies the constraints of  $ILP(\mathcal{I}')$ , because 881 all vertices of each twin class are colored exactly once. Therefore, the objective value 882 of  $ILP(\mathcal{I}')$  is at least the Grundy number. 883

To establish the opposite direction of inequality, let  $\mathcal{I}'$  be an eligible sub-collection 884 of  $\mathcal{I}$  achieving the maximum ILP objective value. Notice that  $ILP(\mathcal{I}')$  is feasible, and 885 let  $x_I^*$  be the value taken by the variable  $x_I$  for each  $I \in \mathcal{I}'$ . Since  $\mathcal{I}'$  is eligible, there 886 exists an ordering  $\leq$  on  $\mathcal{I}'$  such that for every  $I, I' \in \mathcal{I}'$  with  $I \succeq I'$ , and for every 887  $i \in I$ , there exists  $i' \in I'$  such that the twin classes  $W_i$  and  $W_{i'}$  are adjacent. Now, 888 we can define the coloring  $V_1 \cup \cdots \cup V_\ell$  by taking the first (i.e. minimum element in  $\preceq$ ) 889 element  $I_1$  of  $\mathcal{I}' x_I^*$  times. That is, each of  $V_1$  up to  $V_{x_{I_1}^*}$  contains precisely one vertex of 890  $W_i$  for each  $i \in I$ . The succeeding element  $I_2$  similarly yields the next  $x_{I_2}^*$  colors, and 891 so on. From the constraint of  $ILP(\mathcal{I}')$ , we know that the constructed coloring indeed 892 partitions V. The eligibility of  $\mathcal{I}'$  ensure that this is a Grundy coloring. Finally, 893 observe that the number of colors in the constructed coloring equals the objective 894 value of  $ILP(\mathcal{I}')$ . This proves that the latter value is the lower bound for the Grundy 895 number. 896

THEOREM 6.5. Let G = (V, E) be a graph of neighborhood diversity w. The 897 Grundy number of G can be computed in time  $2^{O(w^{2^w})}n^{O(1)}$ . 898

*Proof.* We first compute the partition  $V = W_1 \dot{\cup} \dots \dot{\cup} W_w$  of G into twin classes 899 in polynomial time. By Lemma 6.1, we may assume that each  $W_i$  is a true twin class 900 by discarding some vertices of G, if necessary. Next, we compute  $\mathcal{I}$  and notice that  $\mathcal{I}$ 901 contains at most  $2^w$  elements. For each  $\mathcal{I}' \subseteq \mathcal{I}$  we verify if  $\mathcal{I}'$  is eligible (this can be 902 done in by trying all w! orderings of the elements of  $\mathcal{I}'$ ). 903

For each eligible sub-collection of  $\mathcal{I}'$  of  $\mathcal{I}$ , we solve  $ILP(\mathcal{I}')$  using Lenstra's algo-904 rithm which runs in time  $O(n^{2.5n+o(n)})$ , where n denotes the number of variables in 905 a given linear integer program [67, 52, 41]. As  $ILP(\mathcal{I}')$  contains as many as  $|\mathcal{I}'| \leq 2^w$ 906 variables, this lead to an ILP solver running in time  $2^{O(w^{2^w})}$ . Due to Lemma 6.4, we 907

can correctly compute the Grundy number by solving  $ILP(\mathcal{I}')$  for each eligible  $\mathcal{I}'$  and taking the maximum.

**6.2.** Modular-width. Let G = (V, E) be a graph. A module is a set  $X \subseteq V$  of vertices such that  $N(u) \setminus X = N(v) \setminus X$  for every  $u, v \in X$ , that is, their neighborhoods coincide outside of X. Equivalently, X is a module if all vertices of  $V \setminus X$  are either connected to all vertices of X or to none. The modular width of a graph G = (V, E)is defined recursively as follows: (i) the modular width of a singleton vertex is 1 (ii) G has modular width at most k if and only if there exists a partition  $V = V_1 \cup ... \cup V_k$ , such that for all  $i \in [k]$ ,  $V_i$  is a module and  $G[V_i]$  has modular width at most k.

917 Our main tool in this section will be the following lemma which will allow us to 918 reduce GRUNDY COLORING parameterized by modular width to the same problem 919 parameterized by neighborhood diversity. We will then be able to invoke Theorem 6.5. 920 The idea of the lemma is that once we compute the Grundy number of a module of 921 a graph G we can remove it and replace it with an appropriately sized clique without 922 changing the Grundy number of G.

923 LEMMA 6.6. Let G = (V, E) be a graph and  $X \subseteq S$  be a module of G. Let G'924 be the graph obtained by deleting X from G and replacing it with a clique X' of size 925  $\Gamma(G[X])$ , such that in G' we have that all vertices of X' are connected to all neighbors 926 of X in G. Then  $\Gamma(G) = \Gamma(G')$ .

*Proof.* Let  $k = \Gamma(G[X]) = |X'|$ . First, let us show that  $\Gamma(G') \ge \Gamma(G)$ . Take a 927 928 Grundy coloring of G. Our main observation is that the vertices of X are using at most k distinct colors in the coloring of G. To see this, suppose for contradiction 929 that the vertices of X are using at least k+1 colors. We will show how to obtain a 930 Grundy coloring of G[X] with at least k+1 colors. As long as there is a color in the 931 Grundy coloring of G which does not appear in X, let c be the highest such color. We 932 delete from G all vertices which have color c, and decrease by 1 the color of all vertices 933 934 that have color greater than c. This modification gives us a valid Grundy coloring of the remaining graph, without decreasing the number of distinct colors used in X. 935 Repeating this exhaustively results in a graph where every color is used in X. Since 936 X is a module, that means that the resulting graph is G[X], and we have obtained a 937 Grundy coloring of G[X] with k+1 or more colors, contradiction. 938

Assume then that in the optimal Grundy coloring of G, the vertices of X use k' < k' < 1939 k distinct colors. Let G'' be the induced subgraph of G' obtained by deleting vertices 940 of X' so that there are exactly k' such vertices left in the graph. We claim  $\Gamma(G') \geq 1$ 941  $\Gamma(G'') \geq \Gamma(G)$ . The first inequality follows from the standard fact that Grundy 942 coloring is closed under induced subgraphs (indeed, in the First-Fit formulation of 943 the problem we can place the deleted vertices of G' at the end of the ordering). To 944 see that  $\Gamma(G'') \geq \Gamma(G)$  we take the optimal coloring of G and use the same coloring 945 in  $V \setminus X$ ; furthermore, for each distinct color used in a vertex of X we color a vertex 946 of X' with this color. Observe that this is a proper coloring of G''. Furthermore, for 947 each  $v \in V \setminus X$ , the set of colors that appears in N(v) is unchanged; while for  $v \in X'$ , 948 949 v sees at least the same colors in its neighborhood as a vertex of X that received the same color. 950

Let us also show that  $\Gamma(G) \geq \Gamma(G')$ . Consider a k-Grundy coloring of G[X] and let  $X_1, X_2, \ldots, X_k$  be the corresponding partition of X. Label the vertices of X' as  $x_1, \ldots, x_k$ . We will now show how to transform a Grundy coloring of G' to a Grundy coloring of G: we use the same colors as in G' for all vertices in  $V \setminus X$ ; and we use for each vertex of  $X_i$  the same color that is used for  $x_i$  in G'. This is a proper coloring, as each  $X_i$  is an independent set, the vertices of X' use distinct colors in G' (as they form a clique), and a vertex connected to X in G is also connected to all of X' in G'. Furthermore, each vertex  $v \in V \setminus X$  sees the same set of colors in its neighborhood in G and in G': if v is not connected to X its neighborhood is completely unchanged, while if it is v sees in X the same k colors that were used in X'. Finally, for each  $i \in [k]$ , each vertex of  $X_i$  sees the same colors in its neighborhood as  $x_i$  does in G'.  $\Box$ 

962 We can now prove the main result of this section.

THEOREM 6.7. Let G = (V, E) be a graph of modular-width w. The Grundy number of G can be computed in time  $2^{O(w2^w)}n^{O(1)}$ .

Proof. Given a graph G = (V, E) of modular width w it is known that we can compute a partition of V into at most w modules  $V_1, \ldots, V_w$  [83]. If one of these modules  $V_i$  is not a clique or an independent set, we call this algorithm recursively on  $G[V_i]$  (which also has modular width w) and compute  $\Gamma(G[V_i])$ . Then, by Lemma 6.6 we can replace  $V_i$  in G with a clique of size  $\Gamma(G[V_i])$ . Repeating this produces a graph where each module is a clique or an independent set. But then G has neighborhood diversity w, so we can invoke Theorem 6.5.

7. Conclusions. We have shown that GRUNDY COLORING is a natural problem 972 that displays an interesting complexity profile with respect to some of the main graph 973 widths. One question left open with respect to this problem is its complexity param-974 eterized by feedback vertex set. A further question is the tightness of our obtained 975 results under the ETH. The algorithm we obtain for pathwidth has running time with 976 parameter dependence  $2^{O(pw^2)}$ . Is this optimal or is it possible to do better? Simi-977 larly, our reduction for treewidth shows that it's not possible to solve the problem is 978  $n^{O(\sqrt[4]{tw})}$ , but the best known algorithm runs in  $n^{O(tw^2)}$ . Can this gap be closed? 979

A broader question is also whether we can find other examples of natural problems 980 that separate the parameters treewidth and pathwidth. The reason that GRUNDY 981 COLORING turns out to be tractable for pathwidth is purely combinatorial (the 982 value of the optimal is bounded by a function of the parameter). In other words, 983 the "reason" why this problem becomes easier for pathwidth is not that we are able 984 to formulate a different algorithm, but that the same algorithm happens to become 985 more efficient. It would be interesting to find some natural problem for which path-986 987 width offers algorithmic footholds in comparison to treewidth that cannot be so easily explained. One possible candidate for this may be PACKING COLORING [59]. 988

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