

# 1 Stabilization Time in Minority Processes

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## 8 — Abstract —

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9 We analyze the stabilization time of minority processes in graphs. A minority process is a dynamically  
10 changing coloring, where each node repeatedly changes its color to the color which is least frequent  
11 in its neighborhood. First, we present a simple  $\Omega(n^2)$  stabilization time lower bound in the  
12 sequential adversarial model. Our main contribution is a graph construction which proves a  $\Omega(n^{2-\epsilon})$   
13 stabilization time lower bound for any  $\epsilon > 0$ . This lower bound holds even if the order of nodes is  
14 chosen benevolently, not only in the sequential model, but also in any reasonable concurrent model  
15 of the process.

16 **2012 ACM Subject Classification** Mathematics of computing → Graph coloring; Theory of compu-  
17 tation → Self-organization; Theory of computation → Distributed computing models

18 **Keywords and phrases** Minority process, Benevolent model

19 **Digital Object Identifier** 10.4230/LIPIcs.ISAAC.2019.46

20 **Related Version** An archive version is available at <https://arxiv.org/abs/1907.02131>.



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30th International Symposium on Algorithms and Computation (ISAAC 2019).

Editors: Pinyan Lu and Guochuan Zhang; Article No. 46; pp. 46:1–46:19

Leibniz International Proceedings in Informatics



LIPICs Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany

## 1 Introduction

If you google “bad wifi”, one advice you will get for sure is to choose the least crowded frequency in order to minimize interference with your neighbors. Unfortunately, this least crowded frequency may change again if some of your neighbors do the same.

Frequency allocation is a familiar example of *minority processes* in graphs: given a graph, a set of colors, and an initial coloring of the nodes with these colors, a minority process is a process where each node, when given the chance to act, modifies its color to a color that has the smallest number of occurrences in its neighborhood. This results in a dynamically changing coloring, which is essentially a form of distributed automata. Minority processes arise in various fields of economics [12] or social science [3] when players are motivated to differentiate from each other, but they also emerge in cellular biology [4] or crystallization mechanics [2].

A minority process is said to stabilize when no node has an incentive to change its color anymore. The aim of the paper is to understand how long it takes until such a minority process reaches a stable state. We study the process in several different models, some of them sequential, some concurrent. In sequential models, when only one node at a time can change its color, stabilization time depends on the choice of the order of nodes. Hence, the model can further be subdivided into three cases, depending on whether the order of acting nodes is specified benevolently (trying to minimize stabilization time), adversarially (trying to maximize stabilization time), or randomly.

On the other hand, in concurrent models, multiple nodes are allowed to switch their color at the same time. However, if two (or more) neighboring nodes continuously keep on forcing each other to switch their color, the system may never stabilize. The simplest such example is a graph of two connected nodes that have the same initial color, and keep on switching to the same new color in every step. We also study concurrent models that exclude this behavior, as it is unrealistic in many application areas where neighbors are unlikely to switch at the exact same time.

In any model where simultaneous neighboring switches are excluded, it is easy to prove a  $O(n^2)$  upper bound on stabilization time for minority processes. Initially, some (maybe even all) of the at most  $O(n^2)$  edges in the graph are monochromatic (i.e., they have a *conflict*). When a node switches its color to the minority color in its neighborhood (but its neighbors do not change color in the same step), then the number of conflicts on the adjacent edges strictly decrease. Since the original number of conflicts is  $O(n^2)$  and the overall number of conflicts decreases by 1 at least in each step, the number of steps is limited to  $O(n^2)$ .

However, this raises a natural question: are there example graphs that exhibit this naive upper bound? Or is there a significantly lower (e.g. linear) upper bound on stabilization time in some models? While these questions are already answered for the “dual” problem of majority processes (when nodes switch to the most frequent color in their neighborhood), for the case of minority processes, they have remained open so far.

The main contributions of the paper are constructions that prove lower bounds on stabilization time of minority processes. As a warm-up, we present a simple example in Section 4 which shows that in the sequential adversarial model, stabilization may take  $\Theta(n^2)$  steps. Our main result is a construction proving that stabilization can also take superlinear time in the sequential benevolent case. We first present a graph and an initial coloring in Section 5 where any selectable sequence lasts for  $\Omega(n^{3/2})$  steps. Then in Section 6, we outline how a recursive application of this technique leads to a stabilization time of  $\Omega(n^{2-\epsilon})$  for any  $\epsilon > 0$ , almost matching the upper bound of  $O(n^2)$ . This is an interesting contrast

68 to majority processes, where stabilization time is bounded by  $O(n)$  in the benevolent case.  
 69 Furthermore, our construction shows that this almost-quadratic lower bound holds not only  
 70 in the sequential model, but also in any reasonable concurrent setting.

## 71 **2 Related work**

72 While there is a wide variety of results on both minority and majority processes, majority  
 73 processes have been studied much more extensively. Recently, [5] has shown that stabilization  
 74 time in majority processes can be superlinear both in the synchronous model, and in the  
 75 sequential model if the order is chosen by an adversary. However, [5] has also shown that  
 76 stabilization always happens in  $O(n)$  time in the sequential benevolent model. In case of  
 77 majority processes in weighted graphs, a  $2^{\Theta(n)}$  lower bound on stabilization time was also  
 78 shown in [11].

79 Other aspects of majority processes have also been studied thoroughly, especially in the  
 80 synchronous model. Results on majority processes include basic properties [8], their behavior  
 81 on random graphs [6], complexity results on determining stabilization time [10], minimal sets  
 82 of nodes that dominate the process [7], and the existence of stable states in the process [1].

83 In contrast to this, the dynamics of minority processes has received less attention. The  
 84 stabilization of minority processes has only been studied in special classes of graphs, including  
 85 tori, cycles, trees and cliques [14, 15, 16]. These studies are mostly conducted only in the  
 86 synchronous or the sequential random model. More importantly, these results study a  
 87 different variant of the minority process, which considers the closed neighborhood of nodes,  
 88 and thus can result in significantly larger (possibly exponential) stabilization time, even in  
 89 the unweighted case. An experimental study of the processes on grids is also available in [14].

90 In weighted graphs, it has recently been shown in [13] that stabilization of minority  
 91 processes can take  $2^{\Theta(n)}$  steps in various models, matching a straightforward exponential  
 92 upper bound in the weighted case. However, the constructions of [13] use exponentially large  
 93 node or edge weights to obtain these results; as such, the same techniques are not applicable  
 94 in the unweighted case.

95 Besides these studies on the dynamics of the process, there are also numerous theoretical  
 96 results on stable states in minority processes. These include complexity results on deciding  
 97 the existence of different stable state variants [12], characterization of infinite graphs with a  
 98 stable state [17], and analysis of price of anarchy in such states as local minima [12]. In the  
 99 work of [9], it is also shown that slightly modified minority processes, based on distance-2  
 100 neighborhood of nodes, can provide better local minima at the cost of larger (but still  
 101 polynomial) stabilization time.

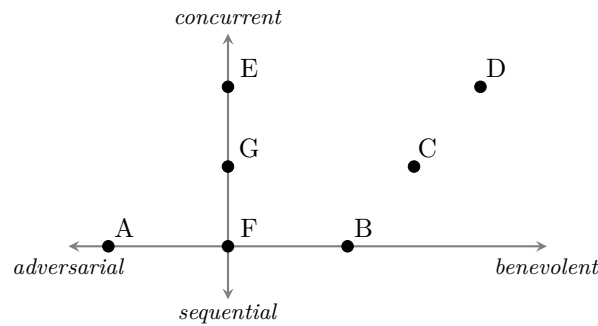
102 However, in contrast to majority processes, the stabilization time of minority processes in  
 103 general unweighted graphs has remained unresolved so far.

## 104 **3 Definitions and background**

### 105 **3.1 Models**

106 In the paper, we primarily focus on the following models:

- 107 **A. Sequential adversarial:** In every step, only one node switches. The order of nodes is  
 108 specified by an adversary who maximizes stabilization time.
- 109 **B. Sequential benevolent:** In every step, only one node switches. The order is specified  
 110 by a benevolent player who minimizes stabilization time.



■ **Figure 1** Properties of the listed models

111 **C. Independent benevolent:** In every step, the benevolent player is allowed to choose  
 112 any independent set of switchable nodes, and switch them simultaneously.

113 **D. Free benevolent:** In each step, the benevolent player is allowed to choose any set of  
 114 switchable nodes, and switch them simultaneously.

115 However, our lower bounds extend to a range of other popular models:

116 **E. Concurrent synchronous:** In every step, all switchable nodes switch simultaneously.

117 **F. Sequential random:** In every step, only one node switches, chosen uniformly at random  
 118 among the switchable nodes.

119 **G. Concurrent random:** In every step, every switchable node switches with probability  $p$ ,  
 120 independently from other nodes.

121 An intuitive illustration of these models is shown in Figure 1. The vertical axis shows  
 122 how concurrent a model is, the horizontal shows how wide is the set of opportunities it grants  
 123 the player to speed up / slow down stabilization. In the case of majority processes, models A  
 124 and E are shown to take superlinear time to stabilize for some graphs, but model B always  
 125 stabilizes in linear time [5]. However, we prove that for minority processes, even model B  
 126 can take superlinear time. Models C and D grant even wider sets of possible (concurrent)  
 127 moves for the benevolent player, which may drastically reduce the number of steps in some  
 128 cases; however, we show that the same lower bound holds even if such moves are available.

129 Note that models A, B, C and F exhibit a natural  $O(n^2)$  upper bound on stabilization  
 130 time, as the overall number of conflicts decreases in each step by at least 1. On the other  
 131 hand, models D, E or G may allow neighboring nodes to switch at the same time, and thus in  
 132 these models, some nodes may keep on endlessly changing colors. However, our constructions  
 133 specifically ensure that connected nodes are never switchable at the same time, and thus for  
 134 these particular graphs, the process stabilizes in any of the models.

135 Through most of the analysis in the paper, we focus on the sequential models. We first  
 136 show a simple construction with  $\Theta(n^2)$  stabilization time in model A. We then present a more  
 137 complex construction to first show  $\Omega(n^{3/2})$ , and then  $\Omega(n^{2-\epsilon})$  stabilization time in model B.  
 138 It then follows from a few observations that these latter constructions also have the same  
 139 stabilization time in models C and D. Since model D provides the widest set of opportunities  
 140 from all models, this implies the same lower bound for each of the listed models.

## 141 3.2 Preliminaries

142 Throughout the paper, we consider simple, unweighted, undirected graphs. Graphs are  
 143 denoted by  $G$ , their number of nodes by  $n$ , and the maximum degree in the graph by  $\Delta$ .

144 Given a graph  $G$  on the vertex set  $V$ , an *independent set* is a subset of  $V$  such that no two  
 145 nodes in this subset are connected. A *coloring* of the graph with  $k$  colors is the assignment  
 146 of one of the colors (numbers) from  $\{1, 2, \dots, k\}$  to each of the nodes. If two nodes share an  
 147 edge and are assigned the same color, then the nodes have a *conflict* on this edge.

148 Our process consists of discrete time steps (*states*), where we have a current coloring of  
 149 the graph in every state. When a node  $v$  is currently colored  $c_1$ , but there exists a color  $c_2$   
 150 such that the neighborhood of  $v$  contains strictly less nodes colored  $c_2$  than nodes colored  $c_1$ ,  
 151 then the node is *switchable* (since the node could reduce its number of conflicts by changing  
 152 its color). The process of  $v$  changing its color is *switching*. Nodes always make locally optimal  
 153 solutions, that is, they switch to the color which is least frequent in their neighborhood.  
 154 In case of multiple optimal colors, related work on majority processes considers different  
 155 tie-breaking rules. However, our constructions ensure that a tie can never occur, and thus  
 156 our bounds hold for any tie-breaking strategy.

157 The *minority process* is a sequence of steps, where each step is described by a set of nodes  
 158 that switch. Note that we only consider valid steps, where every chosen node is switchable.

159 A state is *stable* when no node in the graph is switchable; a system *stabilizes* if it reaches  
 160 a stable state. *Stabilization time* is the number of steps until the process stabilizes. Note  
 161 that in case of model E, papers studying majority processes often use a different definition of  
 162 stabilization, based on periodicity. However, our constructions ensure that the process always  
 163 ends in a stable state, thus for the graphs in the paper, the two definitions of stabilization  
 164 are equivalent.

165 In our examples, we will consider the case of having only two available colors, black and  
 166 white. However, as discussed in Section 3.3, our lower bounds are easy to generalize to any  
 167 number of colors.

168 The restriction to two colors allows us to introduce some helpful terminology. Consider a  
 169 node  $v$  at a given state of the process. If  $v$  has  $v_s$  neighbors with the same color as  $v$ , and  $v_o$   
 170 neighbors with the opposite color, the number  $v_o - v_s$  is called the *balance* of  $v$ . Note that  
 171 if one of the neighbors of  $v$  switches, then the balance of  $v$  either increases or decreases by  
 172 2 (which shows that the parity of the balance of  $v$  can never change). The definition also  
 173 implies that  $v$  is switchable if and only if its balance is negative. Switching  $v$  changes the  
 174 sign of its balance.

### 175 3.3 General tools in the constructions

176 **Groups.** We use the notion *group* to refer to a set of nodes that have the same initial color  
 177 and the exact same set of neighbors (hence, groups are independent sets). Groups are, in  
 178 fact, only a tool to consider certain nodesets together as one entity for simpler presentation.  
 179 They will be shown as only one node with double borders in the figures, with the size of the  
 180 group indicated in brackets.

181 In the adversarial case, we will only consider sequences that switch groups together (i.e.  
 182 consecutively in any order). In the benevolent case, groups will be switched together in the  
 183 sense that if a node in the group switches, then all other nodes in the group will also switch  
 184 before any neighbor of the group becomes switchable; this property is enforced by the graph  
 185 construction. The more complicated definition in the benevolent case is due to the fact that  
 186 we have to consider every possible sequence that the player can choose. Technically, in some  
 187 sequences, a group might not be switched consecutively (it might be interrupted by switches  
 188 in other, distant parts of the graph), but the outcome will still be equivalent to switching  
 189 them consecutively.

190 **Fixed nodes.** Given a graph  $G$ , let us add two more set of nodes  $F_w, F_b$  to the graph such  
 191 that  $|F_w| = |F_b| = n + 1$ , and  $v_w$  and  $v_b$  are connected for all  $v_w \in F_w, v_b \in F_b$ . Let the  
 192 color of  $F_w$  and  $F_b$  initially be white and black, respectively. The nodes in  $F_w$  and  $F_b$  will  
 193 be referred to as *fixed nodes*, and we will connect them to some of the nodes in our original  
 194 graph. Note that these fixed nodes already have  $n + 1$  neighbors of the opposite color, and  
 195 can never have more neighbors of the same color (as they can have at most  $n$  neighbors  $G$ ),  
 196 so their color is indeed fixed and they can never switch.

197 Such fixed nodes are widely used in our construction; we can allow any node in  $G$  to  
 198 have up to  $\Delta + 1$  fixed neighbors of either color. The introduction of fixed nodes increases  
 199 the graph size only by a constant factor (to  $3n + 2$ ), so all lower bounds expressed as a  
 200 function of  $n$  will still be of the same magnitude as a function of  $3n + 2$ . Therefore, for ease  
 201 of presentation, we still use  $n$  to denote the number of nodes in the graph *without* the extra  
 202 fixed nodes, and express our bounds as a function of  $n$ .

203 Fixed node neighbors are denoted by squares in the figures, with the multiplicity written  
 204 beside the square (if more than 1). We always draw separate squares for distinct nodes, even  
 205 though the corresponding fixed node sets might overlap. This is because fix node connections  
 206 are thought of as a “property” of the node, introducing an offset into its initial balance.

207 **Generalization to more colors.** While the paper discusses the case of two colors, a simple  
 208 idea allows a generalization to any constant number of colors  $k$ . Assume we have a construction  
 209  $G$  on  $n$  nodes, showing a lower bound on stabilization time with two colors; we can simply  
 210 add sets of nodes  $F_3, F_4, \dots, F_k$  of size  $\Delta + 1$  such that they form a complete multipartite  
 211 graph, and connect all these new nodes to all nodes in  $G$ . Let us color the nodes in  $F_i$  with  
 212 color  $i$ .

213 None of the original nodes in  $G$  will ever assume any of the colors 3, 4, ...,  $k$ , since  
 214 they always have  $\Delta + 1$  neighbors of these colors, while they have strictly less (at most  $\Delta$ )  
 215 neighbors of colors 1 and 2. Nodes in  $F_i$  will never have any incentive to switch, since they  
 216 have no conflicts at all. Thus the process will behave as if the graph only consisted of  $G$   
 217 with colors 1 and 2. As the new nodes only increase the graph size by a constant factor, we  
 218 receive an example with the same magnitude of running time, but with  $k$  colors.

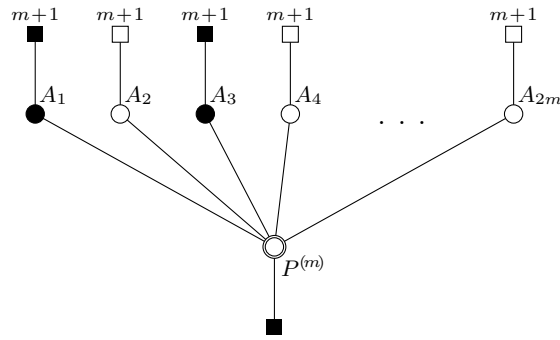
219 With the same technique, our lower bound of  $\Omega(n^{3/2})$  can also be generalized to the case  
 220 of up to  $\Theta(\sqrt{n})$  colors; details of this are discussed in Appendix B.

## 221 **4 Sequential adversarial model**

222 We first present a simple example where model A takes  $\Omega(n^2)$  steps. Our construction, shown  
 223 in Figure 2, consist of a group  $P$  of size  $m$  (for some parameter  $m$ ), initially colored white,  
 224 and  $2m$  distinct nodes  $A_1, A_2, \dots, A_{2m}$ , such that  $A_i$  is initially colored black for odd values  
 225 of  $i$  and white for even  $i$ . Let us connect all nodes  $A_i$  to  $P$ , and add one more fixed black  
 226 node that is connected only to  $P$ . Finally, let us connect each  $A_i$  to  $m + 1$  fixed nodes of the  
 227 same color as  $A_i$ . Recall that although the figure shows multiple squares, there are in fact  
 228 only  $n + 1$  fixed black and  $n + 1$  fixed white nodes in the graph altogether.

229 In this graph,  $P$  has a balance of 1 initially, while black  $A_i$  have a balance of  $-1$  and  
 230 white  $A_i$  have a balance of  $-(2m + 1)$ . Note that even after execution begins, until  $A_i$  is  
 231 switched for the first time, it will have  $m + 1$  fixed neighbors of the same color and at most  
 232  $m$  neighbors of the opposite color (depending on the current color of  $P$ ), and thus a negative  
 233 balance. Therefore, each  $A_i$  is switchable anytime if it has not been switched before.

234 Consider the following sequence of adversarial moves in this graph: the player first decides



■ **Figure 2** Construction with an adversarial sequence of  $\Theta(n^2)$  switches

235 to switch  $A_1$ , then  $P$ , then  $A_2$ , then  $P$  again, then  $A_3$ ,  $P$ , ...,  $A_{2m}$ , and finally  $P$  again. As  
 236 each  $A_i$  is used only once, they are clearly all switchable. As for  $P$ , its balance first changes  
 237 from 1 to  $-1$ , when changing  $A_1$  to white, but increases back to 1 when we switch  $P$  itself.  
 238 Then it changes to  $-1$  once again after changing  $A_2$ , so it is switchable again, and so on:  
 239 each time we switch an  $A_i$ , we change it to the same color that  $P$  currently has, decreasing  
 240  $P$ 's balance to  $-1$ , which increases back to 1 again as we switch  $P$ . Therefore, this strategy  
 241 is indeed a sequence of valid switches.

242 Since  $P$  contains  $m$  nodes and is switched  $2m$  times in this sequence, this alone contributes  
 243 to  $2m^2$  switches. Altogether, we have  $3m$  nodes in the graph (without fixed nodes), allowing  
 244 us a choice of  $m = \frac{n}{3}$ . This gives us a sequence with at least  $\frac{2}{9}n^2$  steps.

245 ► **Theorem 1.** *There exists a graph construction with  $\Omega(n^2)$  stabilization time in model A.*

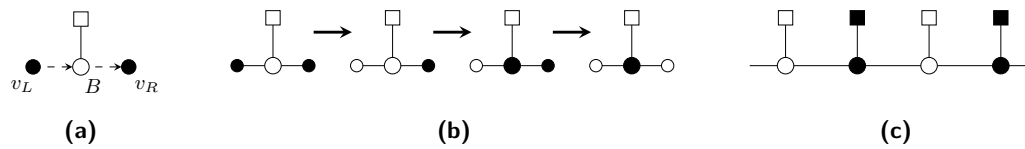
246 **5 Construction for benevolent models**

247 We now presents a construction with  $\Omega(n^{3/2})$  stabilization time in benevolent models. Note  
 248 that it is much more involved to find an example where benevolent models take  $\omega(n)$  steps,  
 249 since in such a construction, we have to ensure that any possible sequence lasts for a long  
 250 time. In order to have an easy-to-analyze construction, our graph will, at any point in  
 251 time, contain only one, or a small set of nodes that are switchable, and switching this or  
 252 these nodes enables the next such set of nodes (i.e., makes them switchable). This way, the  
 253 switchable point “propagates” through the graph, and the benevolent player has no other  
 254 valid move than to follow this path of propagation that has been designed into the graph.

255 The general idea behind the construction is to have a linearly long chain of nodes which is  
 256 propagated through multiple times. After each such round, the propagation enters a different  
 257 branch of further nodes; this branch resets the chain for the following round, and then also  
 258 triggers the following round of propagation (as outlined later in Figure 11).

259 Due to the complexity of the construction, we do not describe it directly; instead, we  
 260 define smaller functional elements (*gadgets*) that execute a certain task. We then use these  
 261 gadgets as building blocks to put our example graph together. This section outlines the tasks  
 262 and main properties of the gadgets; a detailed description and analysis of each gadget can be  
 263 found in Appendix B. While the concrete gadget designs are specific to minority processes,  
 264 they are built on general ideas and techniques for benevolent models; as such, we hope they  
 265 may inspire similar solutions in the analysis of related processes or cellular automata.

266 When describing a gadget, the edges connecting the gadget to other nodes in the graphs  
 267 are drawn as dashed lines in the figures, with the external node usually denoted by  $v$  (possibly



■ **Figure 3** Simple relay gadget (a), the steps of its operation (b), and a chain of relays (c)

with some subscript). Although our graph is undirected, we often refer to such edges as *input* or *output* edges of the gadget, and also show this direction in the figures. This will refer to the role that the external node plays in the functionality of the gadget. That is, whenever the gadget is used in our constructions, it is triggered by (some of) its input nodes switching, and upon completing its task, the gadget makes (some of) its output nodes switchable.

Naturally, as in the entire graph, the role of the two colors is always interchangeable within the gadgets. Therefore, we only present each such gadget in one color variant.

Due to the complexity of the construction, we have also verified its correctness through implementing the process. A discussion of these simulations is available in Appendix C.

**Simple relay.** As our most basic tool to propagate the only possible point of switching, we use the *simple relay* shown in Figure 3a. A simple relay consists of a base node  $B$ , connected to a fixed node of the same color, and two further nodes outside of the gadget, which initially have the opposite color as  $B$ . Until neither of  $v_L$  and  $v_R$  switch,  $B$  has positive balance and cannot switch either. However, as soon as  $v_L$  switches to the color of  $B$ ,  $B$  becomes switchable, and as  $B$  switches, this propagates the point of change to its other neighbor  $v_R$  (as shown in Figure 3b).

Note that connecting alternating-colored relays into a chain already gives a simple example of linear stabilization time (see Figure 3c). If the leftmost (white) relay's base node is connected to a fixed white node, then the only available sequence of moves is to switch the base nodes in the relays one by one from left to right, resulting in a sequence of  $n$  steps.

Through the concept of input and output nodes, relays essentially allow us to connect other, more sophisticated gadgets in our constructions. If some gadget has an output node  $v_1$  and another gadget has an input node  $v_2$ , we can add a chain of relays between  $v_1$  and  $v_2$ , ensuring that once  $v_1$  switches, it will be followed by  $v_2$  eventually. Due to this role, relays are not shown explicitly in our final overview figure of the construction, but only represented by arrows, indicating the direction of propagation between more complex gadgets.

**Rechargeable relay.** A more sophisticated version of a relay is the *rechargeable relay* shown in Figure 4a. In such a relay, node  $B$  is extended by an upper node  $U$ , a control group  $C$  of size 2, and two recharge nodes  $R_1, R_2$ , the role of which are interchangeable. Besides  $v_L$  and  $v_R$ , the nodes  $R_1$  and  $R_2$  also have edges to some external nodes. It is always ensured that the initial balance of  $R_1$  and  $R_2$  from these upper neighbors (that is, with  $C$  ignored) is exactly 3.

As in case of a simple relay, if  $v_L$  switches, then  $B$  itself can switch, followed by  $v_R$ . Now assume that in this “used” phase of the relay, some outside circumstance changes 3 neighbors of node  $R_2$  from black to white, and thus its balance changes from the current value of 5 to  $-1$  (the relay is *recharged*). Then  $R_2$  can switch to black, making  $C$  and in turn  $U$  switch, too. Finally, assume that some other outside circumstance then changes the balance of  $R_2$  from 5 to  $-1$  again (known as *resetting* the relay); then  $R_2$  will switch back to white (with a new balance of 1), and we end up in the initial state of a rechargeable relay of the opposite



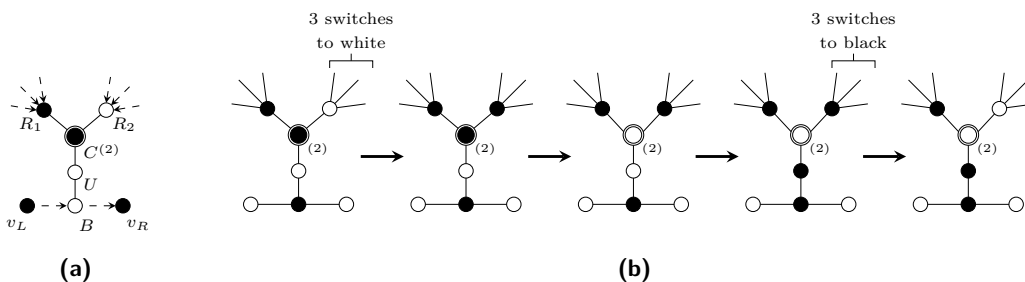


Figure 4 Rechargeable relay gadget (a) and the steps of its operation (b)

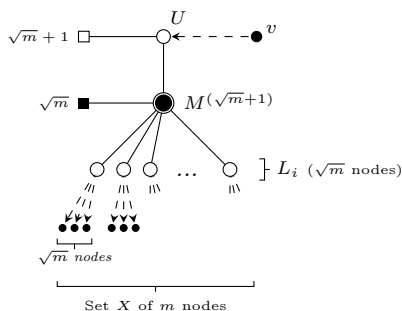


Figure 5 Basic recharging system

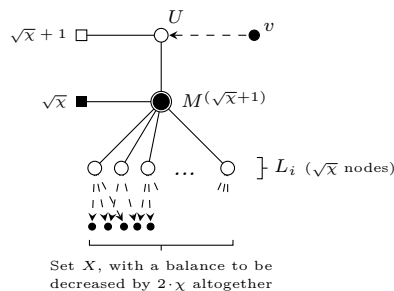


Figure 6 Generalized recharging system

307 color. The steps of the process are shown in Figure 4b.

308 This is exactly the essence of this gadget: it is a relay which can be used the same way  
 309 multiple times. Connecting such gadgets into a chain in the same fashion as Figure 3c, we  
 310 get a chain that can propagate the point of change not only once, but multiple times if  
 311 “recharged” through their upper connections between two such propagations.

312 **Recharging system.** The rechargeable relay suggests that it is useful to have a tool to  
 313 “recharge” some nodes, i.e. to decrease their balance by switching some of their neighbors  
 314 to the color they currently have. To execute this task efficiently on many nodes, we present a  
 315 *recharging system*.

316 For the first version of this gadget, assume a setting where there is a set  $X$  of  $m$  black  
 317 nodes, and we want to decrease the balance of each of these nodes by 2 (i.e., change exactly  
 318 one white neighbor of each of them to black). A *basic recharging system*, shown in Figure 5,  
 319 can execute this task while using only  $O(\sqrt{m})$  nodes. The gadget is organized into 3 levels:  
 320 a single node  $U$  in the upper level, a group  $M$  of  $\sqrt{m} + 1$  nodes in the middle level, and  
 321  $\sqrt{m}$  distinct nodes  $L_i$  in the lower level. Each lower level node is connected to  $\sqrt{m}$  different  
 322 nodes in  $X$ , thus exactly covering the nodes of  $X$ . The gadget operates in a top-to-bottom  
 323 fashion: once  $v$  switches,  $U$  turns black, followed by  $M$  turning white. Once all nodes in  $M$   
 324 are switched, the nodes  $L_i$  all decide to switch, too.

325 The key idea in the design of the gadget is that each node  $L_i$  has strictly more neighbors  
 326 in  $M$  than in  $X$ . This ensures that as long as  $M$  is black, the nodes  $L_i$  always have a positive  
 327 balance, regardless of the current color of their neighbors in  $X$ . Therefore, no node in the  
 328 gadget can ever switch before the node  $U$  is triggered.

329 We can use this insight to create a similar gadget for a more general setting. Assume  
 330 that we similarly have a set  $X$  of  $m$  black nodes, but instead of decreasing their balance by  
 331 2, we want to decrease the balance of each node in  $X$  by some specific (possibly different)

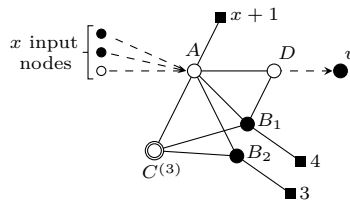


Figure 7 AND gate

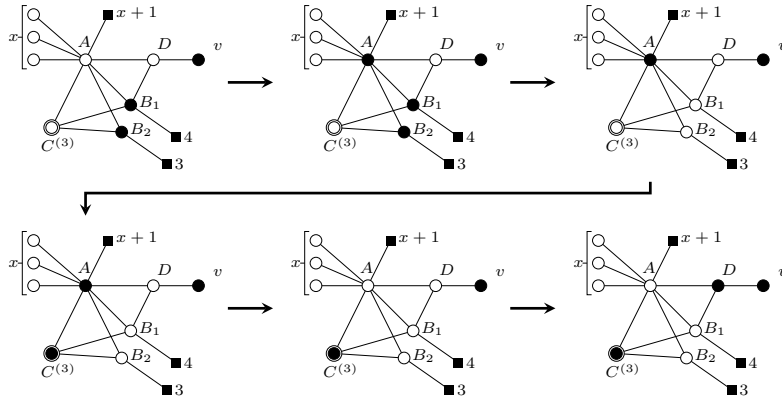


Figure 8 Operation of an AND gate. In the end, node  $D$  switches to black, making  $v$  switchable.

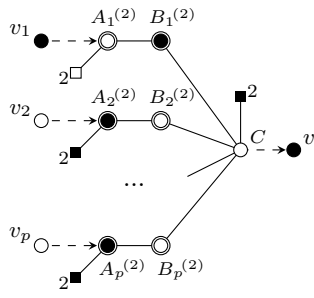
332 even value, denoted by  $2x_1, 2x_2, \dots, 2x_m$  (i.e., for the  $j^{\text{th}}$  node in  $X$ , we want to change  $x_j$   
 333 of its white neighbors to black). Let us denote the sum  $\sum_{j=1}^m x_j$  of these values by  $\chi$ .

334 We can achieve this using a similar construction, shown in Figure 6. In this *generalized*  
 335 *recharging system*, we allow multiple nodes  $L_i$  to be connected to the same node in  $X$ : if a  
 336 node in  $X$  has a corresponding value  $2x_j$ , then it has exactly  $x_j$  neighbors in the lower level  
 337 of the system. This ensures that once all the nodes  $L_i$  switch, the new balance of each node  
 338 in  $X$  is exactly as desired. The number of nodes in the gadget can be minimized by placing  
 339  $\sqrt{\chi}$  nodes  $L_i$  in the lower level, each with  $\sqrt{\chi}$  neighbors in  $X$ ; this way, the overall number  
 340 of edges going into the set  $X$  from the gadget is exactly  $\chi$  as required. To ensure that the  
 341 neighborhood of each  $L_i$  is dominated by  $M$ , we choose the size of group  $M$  to be  $\sqrt{\chi} + 1$ .

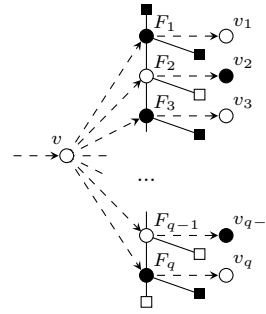
342 **AND gate.** Another ingredient we use is an AND gate. As its name suggests, this gadget  
 343 has  $x$  input edges from a set of nodes  $X$ , and once all nodes in  $X$  have switched to the same  
 344 color (say, white), the gadget triggers a change in another part of the graph.

345 Note that we could achieve this functionality with a single node, by carefully setting its  
 346 initial balance such that it switches exactly when all inputs have the desired color. However,  
 347 AND gates are used to “check” the state of specific nodes in the construction, and as such, it  
 348 is unfortunate that this check also affects the nodes that are being checked: once the node  
 349 in this simple AND gate switches, the balance of all input nodes in  $X$  will increase by 2. It  
 350 would be much better to have a gadget that can perform this task without having any effect  
 351 on the nodes in  $X$ .

352 For this purpose, consider the gadget in Figure 7, which is connected to the nodes in  $X$   
 353 on the input side and a black node  $v$  on the output side. Once all nodes in  $X$  are white, node  
 354  $A$  switches, followed by  $B_1$  and  $B_2$ , and then by  $C$ . With  $C$  switched,  $A$  decides to switch  
 355 back to its original color white. However, since now both  $A$  and  $B_1$  are white, this finally



■ Figure 9 Join gadget



■ Figure 10 Fork gadget

356 switches  $D$  to black, triggering a change in the output node  $v$  (Figure 8). The usefulness of  
 357 the gadget lies in the fact that by the end of this sequence,  $A$  is switched back to its original  
 358 color, and thus the balance of nodes in  $X$  is again the same as it was in the beginning.

359 **Join and fork gadgets.** Finally, we need two small gadgets in the construction to fork and  
 360 join the control sequence at the ends of our main relay chain.

361 A join gadget, shown in Figure 9, connects a specific number of input nodes  $v_i$  to an  
 362 output node  $v$ . When an input node  $v_i$  switches, then so does  $A_i$  and then  $B_i$  in the  
 363 corresponding input branch, which also switches  $C$  and triggers node  $v$ . Then when  $v_{i+1}$   
 364 later switches at some point, the same thing happens to the next input branch and  $C$  again,  
 365 only with the two colors swapping roles. Thus if the nodes  $v_1, v_2, \dots$  are switched one after  
 366 another in this order, then each of these input switches make the output node  $v$  switch again.

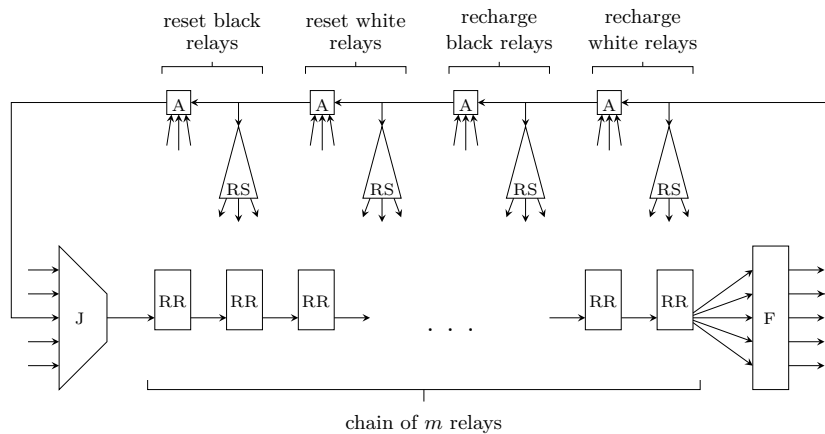
367 The fork gadget of Figure 10, on the other hand, is responsible for receiving triggers from  
 368 a given input node  $v$ , and directing the propagation to a new branch (a new output node  $v_i$ )  
 369 every time. When  $v$  first switches, only  $v_1$  becomes switchable. Similarly, after  $v$  is switched  
 370 for the  $i^{\text{th}}$  time, only  $v_i$  becomes switchable, and thus the gadget triggers the  $i^{\text{th}}$  branch of  
 371 output.

372 **Assembling the pieces.** Our final graph construction (shown in Figure 11) has two defining  
 373 parameters  $m$  and  $r$ . The base of the construction is a chain of  $m$  rechargeable relays,  
 374 connected to a join gadget of  $r$  branches and a fork gadget of  $r-1$  branches. For each  
 375  $i \in \{1, \dots, r-1\}$ , we add a sequence of gadgets (a *branch*) to connect the  $i^{\text{th}}$  output of the fork  
 376 to the  $i+1^{\text{th}}$  input of the join gadget, which is responsible for recharging the relay chain.

377 Each branch consists of recharging systems connected to our main chain. First let us  
 378 consider the rechargeable relays where node  $U$  is currently white (either the even or the  
 379 odd ones; relays at positions of the same parity are all in the same state). We first need a  
 380 recharging system to recharge all these relays, and then we need another system to reset the  
 381 relays. We need similarly 2 recharging systems for the other half of the relays which are in  
 382 the opposite color phase.

383 Finally, we need to force the player to indeed execute these changes on the relays. For  
 384 that, we insert an AND gate after each recharging system, which checks if all switchable nodes  
 385 have indeed been switched before moving on. The output of the AND gate is then used to  
 386 enable the next recharging systems (or the next input of the join gadget).

387 This construction ensures that the player has no other choice than to go through the  
 388 relay chain, follow the next branch from the fork, recharge and reset all the relays, and start



■ **Figure 11** Overview of the whole construction, with one branch shown in detail. Rechargeable relays (RR), Recharging systems (RS), AND gates (A), Joins (J) and Forks (F) are explicitly shown.

389 going through the relay chain again. Since the chain consists of  $m$  relays and it is traversed  
 390  $r$  times in this process, the switches in the chain add up to  $m \cdot r$  steps altogether.

391 Of course, one also needs to introduce a starting point (initially switchable node) into  
 392 the construction. This can be done by replacing  $v_1$  in the join gadget by a fixed white node.

393 Let us consider the number of nodes in the construction. Since rechargeable relays consist  
 394 of constantly many nodes, the size of the relay chain is  $O(m)$ . The size of the join and  
 395 fork gadgets is  $O(r)$ . Finally, each of the  $r - 1$  recharging branches consist of constantly  
 396 many recharging systems, AND gates and simple relays; since the latter two have constant  
 397 size, branch size is dominated by the size of the recharging systems. Each such system is  
 398 connected to  $\frac{m}{2}$  relays, and thus needs to reduce the balance of  $O(m)$  nodes by a constant  
 399 value of 6. This implies that each recharging system needs  $O(\sqrt{m})$  nodes.

400 This shows that we can choose  $r = \Theta(\sqrt{m})$  and  $m = \Theta(n)$  for our parameters. Our graph  
 401 then contains  $O(m) + O(r) + r \cdot O(\sqrt{m}) = O(n)$  nodes, so it is indeed a valid setting with  
 402 the proper choice of constants.

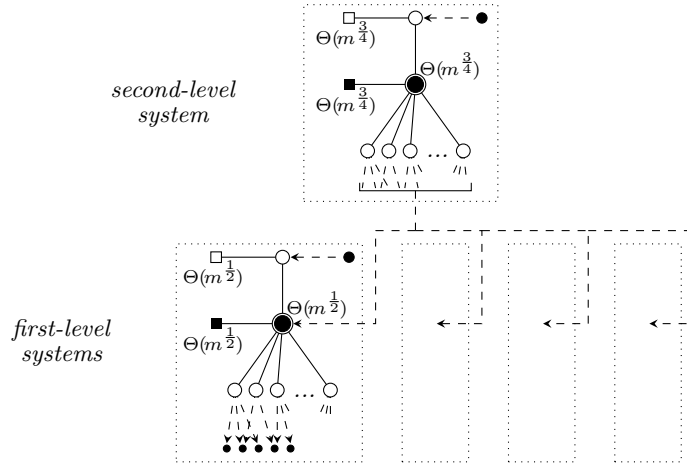
403 To investigate runtime, it is enough to consider the switches in the main relay chain.  
 404 Each of the  $\Theta(n)$  relays has a base node that is switched  $\Theta(\sqrt{n})$  times, adding up to a total  
 405 of  $\Omega(n^{3/2})$  switches.

406 ► **Theorem 2.** *There exists a graph construction with  $\Omega(n^{3/2})$  stabilization time in model B.*

407 Note that in the previous construction, whenever any of the base nodes of the relay chain  
 408 are switchable, there is no other switchable node in the entire graph. This implies that  
 409 even in the independent benevolent case, the player has no other option than to select this  
 410 single node, so the number of minimal switches is  $\Omega(n^{3/2})$  even if we assume the independent  
 411 benevolent model.

412 In fact, one can observe that the construction also ensures that regardless of the choices  
 413 of the player, the set of switchable nodes is always an independent set at any point in the  
 414 process. Hence models C and D are in fact the same in this graph, and thus the lower bound  
 415 also holds for model D. This then implies the same bound for all the remaining models.

416 ► **Corollary 3.** *There is a graph construction with  $\Omega(n^{3/2})$  stabilization time in models C–G.*



■ **Figure 12** Connection of a second-level recharging system to first-level recharging systems. For simplicity, only the recharging of group  $M$  is shown (node  $U$  also has to be recharged).

## 417 6 Recursive construction

418 We now briefly outline the modification idea that provides the almost tight lower bound of  
 419  $\Omega(n^{2-\epsilon})$ . A more detailed discussion of the construction can be found in Appendix A.

420 The key idea is to make the recharging systems themselves also rechargeable, so that  
 421 they can recharge the same output nodes repeatedly. Note that once a recharging system  
 422 has been used, the color of its nodes is exactly that of a recharging system of the opposite  
 423 color. Thus, if we reset the balance of each node in the system to its initial value, we can  
 424 use the system again to recharge the same output nodes again. More specifically, given a  
 425 used recharging system, we need to restore the balance of  $M$  and  $U$  to 1 in order to obtain a  
 426 recharging system of the opposite color; then by triggering  $U$  again, we can use the system  
 427 to recharge the nodes in  $X$  once more.

428 Therefore, we can add a layer of *second-level* recharging systems to recharge all the original  
 429 (first-level) systems in the graph after all first-level system have been used, as illustrated  
 430 in Figure 12. Recall that decreasing the sum of balances in a set of nodes by  $\chi$  requires a  
 431 recharging system of  $O(\sqrt{\chi})$  nodes. We have  $\Theta(\sqrt{m})$  first-level systems in our graph, each  
 432 consisting of  $\Theta(\sqrt{m})$  nodes, with a balance of  $\Theta(\sqrt{m})$  after use; to reset each node in these  
 433 systems to their default balance of 1, with  $\chi = \Theta(m^{3/2})$ , a second-level system requires  
 434  $\sqrt{\chi} = \Theta(m^{3/4})$  nodes.

435 In order to keep the overall number of nodes in second-level systems in  $O(m)$ , we add  
 436  $\Theta(m^{1/4})$  distinct second-level systems to our graph. When used, each of these second-level  
 437 systems recharges all systems on the first level, which in turn allows us to propagate through  
 438 the main relay chain  $\Theta(m^{1/2})$  times again. Therefore, with  $\Theta(m^{1/4})$  second-level systems  
 439 in the construction, the first two levels already allow us to traverse the main relay chain  
 440  $\Theta(m^{1/2}) \cdot \Theta(m^{1/4})$  times.

441 We can continue this technique in a recursive manner. Assume that we have  $\Theta(m^{1/(2^i)})$   
 442 distinct  $i^{\text{th}}$ -level systems in the construction, each consisting of  $\Theta(m^{1-1/(2^i)})$  nodes (which,  
 443 therefore, all have a balance of  $\Theta(m^{1-1/(2^i)})$  after they have been used). We can then use an  
 444  $(i+1)^{\text{th}}$ -level recharging system to recharge all of these  $i^{\text{th}}$ -level systems; since we now have  
 445  $\chi = \Theta(m^{1/(2^i)}) \cdot \Theta(m^{1-1/(2^i)}) \cdot \Theta(m^{1-1/(2^i)}) = \Theta(m^{(2^{i+1}-1)/(2^i)})$ , this requires a next level  
 446 system of  $\sqrt{\chi} = \Theta(m^{(2^{i+1}-1)/(2^{i+1})}) = \Theta(m^{1-1/(2^{i+1})})$  nodes. In order to keep the nodes in

447 this new level also in  $O(m)$ , we only add  $\Theta(m^{1/(2^{i+1})})$  systems to the  $(i + 1)^{\text{th}}$ -level.

448 Generally, these higher-level recharging systems fit into our construction in the following  
 449 way. Every time when first-level systems have all been used, an extra branch is added to  
 450 the construction, which uses one of the second-level systems to recharge the entire first  
 451 level (and does not influence the relay chain). Similarly, whenever we would need such a  
 452 second-level branch but all of them has been used, a third-level branch is added to recharge  
 453 all second-level systems, and the required second-level branch is only visited after traversing  
 454 this third-level branch.

455 Following the recursive pattern, we obtain a construction that allows us to traverse the  
 456 main relay chain  $\Theta(m^{1/2}) \cdot \Theta(m^{1/4}) \cdot \Theta(m^{1/8}) \cdot \dots$  times altogether. If the number of levels  
 457 go to infinity with  $m$  increasing, then for any  $\epsilon > 0$ , there is an  $m$  large enough that the  
 458 number of relay chain traversals is at least  $\Theta(m^{1-\epsilon})$ . Since the relay chain consists of  $\Theta(m)$   
 459 nodes, this leads to a stabilization time of  $\Theta(m^{2-\epsilon})$ .

460 If we have  $\Theta(m^{1/(2^i)})$  recharging systems on the  $i^{\text{th}}$  level, this setting allows us to add  
 461  $\Theta(\log \log m)$  levels until the number of systems on a level decreases to a constant value.

462 Now let us analyze the number of nodes in the graph. On each level, the systems  
 463 contain  $\Theta(m)$  nodes altogether, so the number of nodes in recharging systems adds up to  
 464  $\Theta(m \log \log m)$  over all levels. One can easily show that the size of the graph is dominated by  
 465 these nodes. The number of branches controlling first-level systems is  $\Theta(m^{1/2} \cdot m^{1/4} \cdot m^{1/8} \cdot \dots) =$   
 466  $O(m)$ , the number of branches controlling second-level systems is only  $\Theta(m^{1/4} \cdot m^{1/8} \cdot \dots) =$   
 467  $O(m^{1/2})$ , and so on, the number of  $i^{\text{th}}$ -level branches is  $O(m^{1/2^{i-1}})$ . Summing these up, the  
 468 number of branches altogether is still  $O(m)$ . Apart from recharging systems, each branch  
 469 contains constantly many nodes only (in the form of simple relays, AND gates, and the  
 470 corresponding parts of the fork and join gadgets). This shows that the number of nodes  
 471 outside of the recharging system is only  $O(m)$  altogether, thus the number of nodes in the  
 472 entire graph is indeed  $\Theta(m \log \log m)$ .

473 This allows for a choice of  $m = \Theta(\frac{n}{\log \log n})$ , leading to a stabilization time of  $\Omega(\frac{n^{2-\epsilon}}{(\log \log n)^{2-\epsilon}})$ .  
 474 Since this bound holds for any  $\epsilon > 0$ , we can easily remove the logarithmic factors: a lower  
 475 bound of  $\Omega(n^{2-\epsilon})$  follows from the same construction for any  $\hat{\epsilon} < \epsilon$ . Thus the construction  
 476 shows that the number of steps is  $\Omega(n^{2-\epsilon})$ .

477 Similarly to the non-recursive case, this lower bound holds in all of our models, since  
 478 propagations over the relay chain are still only possible sequentially.

479 ► **Theorem 4.** *For any  $\epsilon > 0$ , there exists a graph construction with  $\Omega(n^{2-\epsilon})$  stabilization*  
 480 *time in models B–G.*

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# 525 Appendices

## 526 **A** Further discussion of the recursive construction

527 While the main idea of the recursive construction has been outlined above, there are some  
528 details worth discussing for completeness.

529 Since a second-level system can only be used to recharge nodes of the same color, every  
530 time we recharge all the first-level systems, we in fact need two second-level recharging  
531 systems, one of each color.

532 Recall that in addition to the group  $M$ , the balance of node  $U$  also has to be reset between  
533 two uses of a recharging system; however, we did not point this out when calculating the  
534 necessary size of systems, since besides  $M$ , a single extra node does not affect the magnitude.  
535 Earlier, we have noted that the recharging systems on a certain level consist of two classes  
536 of systems of different color; observe that the next level systems that recharge the groups  
537  $M$  in one class can simultaneously be used to also recharge the nodes  $U$  in the other class.  
538 Alternatively (for simpler analysis), we can add an extra recharging system (of the same size)  
539 on each branch in order to separately recharge the nodes  $U$  on the level below.

540 Note that the number of total relay chain traversals, which is  $\Theta(m^{1/2} \cdot m^{1/4} \cdot m^{1/8} \cdot \dots)$ ,  
541 is in fact only guaranteed to be at least  $\Theta(m^{1-\epsilon})$  if the coefficients in these factors are  
542 sufficiently large. With an analysis of the constants in the process, one can show that the  
543 coefficient in each factor can indeed be chosen as 1, and thus these constant do not add up  
544 to dividing logarithmic factors when taking the product. However, this is in fact unnecessary,  
545 as any such logarithmic factor could also be removed simply by a smaller choice of  $\epsilon$ .

546 Finally, note that in this recursive setting, recharging systems are slightly modified in the  
547 sense that they have multiple input nodes from multiple different branches, each connected  
548 to node  $U$ . However, this does not modify the behavior of  $U$  as long as its initial balance is  
549 readjusted to 1. This also requires a minor modification in the simple relays that are used as  
550 input nodes, since relays generally assume that their output node never switches before the  
551 relays themselves are triggered. This can be resolved by using a modified relay where the  
552 base node has an initial balance of 3, and thus it is enabled by two distinct simple relays on  
553 the branch.

## 554 **B** Detailed analysis of gadgets

555 Here we provide a more detailed description of the gadgets, and also comment on their  
556 behavior and their use in the construction.

557 **Simple relay.** The construction and behavior of the simple relay has already been described  
558 above. One thing to note is that in our construction, simple relays are always used only once:  
559 after node  $B$  switches, propagation never returns to the same part of the graph again, and  
560 thus node  $B$  will remain unswitchable for the rest of the process.

561 While we mostly use this original version of the gadget, we occasionally need relays with  
562 multiple output nodes instead of just one. This only requires a simple modification: besides  
563 connecting  $x$  extra (black) output nodes to node  $B$ , we also need to add  $x$  fixed (white)  
564 nodes in order to keep the initial balance of  $B$  unchanged.

565 Chains of simple relays are mostly used to connect more complex gadgets in our con-  
566 struction. Note that depending on whether the input and output nodes in these gadgets are



567 supposed to have the same or different initial colors, we only need a chain of length 1 or 2  
 568 for this, respectively.

569 **Rechargeable relay.** In a rechargeable relay, node  $B$  is connected to an upper node  $U$   
 570 instead of a fixed node. Node  $U$  is connected to a group  $C$  of two nodes, which is further  
 571 connected to nodes  $R_1, R_2$ . Initially,  $C$  has the opposite color as  $B$  and  $U$ , and one of  $R_1$   
 572 and  $R_2$  is white, the other is black. Node  $B$  has the same external neighbors as a simple  
 573 relay. The recharge nodes can both have any set of external neighbors as long as their initial  
 574 balance is 3 with  $C$  ignored (so with  $C$  included, the initial balance of  $R_1$  and  $R_2$  is then 1  
 575 and 5, respectively).

576 Note that since  $R_1$  and  $R_2$  have opposite colors, this recharging process can always be  
 577 executed on a used relay through either  $R_1$  or  $R_2$ , depending on the current color of the  
 578 nodes. We only need to select the recharge node that has the current color of  $U$ , and switch  
 579 3 of its neighbors (to  $U$ 's current color) for the recharging step, and then switch 3 of its  
 580 neighbors (to the opposite color) for the resetting step.

581 **Recharging system.** In a basic recharging system, the node  $U$  is connected to the input  
 582 node  $v$ , the group  $M$ , and to  $\sqrt{n} + 1$  fixed white nodes. The middle level group  $M$  has a  
 583 further edge to all nodes  $L_i$ , and is balanced by  $\sqrt{m}$  fixed black nodes. Finally, each node  
 584  $L_i$  has  $\sqrt{m}$  distinct neighbors in  $X$ , and thus each node in  $X$  is connected to exactly one  
 585 lower-level node. For convenience, we assume that  $m$  is a square number.

586 A generalized recharging system is almost identical to this, except for the nodes  $L_i$   
 587 occasionally being connected to the same node. The connections between the lower level  
 588 and  $X$  are not directly specified: we are free to choose which of the nodes  $L_i$  to connect  
 589 to a specific node in  $X$ . Note, however, that the gadget design implicitly assumes that  
 590  $x_j \leq \sqrt{\chi}$  for all nodes in  $X$ . This is naturally satisfied whenever we use the gadget in our  
 591 constructions, since we always have  $x_1 = x_2 = \dots = x_m$  with  $|X| > x_j$ . Also note that for  
 592 convenience, we assume  $\chi$  to be a square number.

593 Nodes in the upper and lower levels are initially white, while  $M$  and the input node  $v$   
 594 are initially black. The nodes  $X$  may assume any color, and also may switch multiple times  
 595 before the recharging system is activated. However, the graph construction ensures that at  
 596 the time when the gadget is activated (that is, when  $v$  switches), all nodes in  $X$  are currently  
 597 colored black (i.e., we indeed use the system on rechargeable relays that can currently be  
 598 recharged). The gadget design ensures that  $U$  and  $M$  have an initial balance of 1, while the  
 599 nodes  $L_i$  have a balance of 1 at least, depending on the current color of their neighbors in  $X$ .

600 **AND gate.** The AND gate consist of 7 nodes. The input nodes of  $X$  are connected to node  
 601  $A$ , which is further connected to all other nodes in the gadget ( $B_1, B_2, D$  and the group  $C$   
 602 on 3 nodes). Nodes  $B_1$  and  $B_2$  are also connected to group  $C$ , node  $B_1$  has an edge to node  
 603  $D$ , and node  $D$  is connected to some external black node  $v$  on the output side. Furthermore,  
 604  $A, B_1$  and  $B_2$  have  $x + 1, 4$  and  $3$  fixed black neighbors, respectively.

605 One can check that each node has a positive balance as long as there exists a black node  
 606 in  $X$ . Node  $A$  gets a balance of  $x - 1$  from the nodes within the gadget, so it is not switchable  
 607 unless all nodes in  $X$  are white. Nodes  $B_1, B_2, C$  and  $D$  all have an initial balance of 1.

608 After the gadget reaches its final stage (see Figure 8), no node in the gadget can ever  
 609 change again, regardless of the states of  $X$  or  $v$ .

610 Note that for the described behavior of the gadget, we also need the fact that none of  
 611 the nodes in  $X$  switch between the first and second switching of  $A$ . The switching of  $A$  only

612 increases their balance (temporarily), so this is guaranteed if other neighbors of nodes in  
 613  $X$  do not interfere with the process. In the construction, we only use AND gates this way:  
 614 whenever a node  $A$  becomes switchable in a gate, then that is the only switchable node in  
 615 the entire graph, so no other nodes will switch until the propagation reaches  $v$ .

616 As long as this condition is fulfilled, we can connect any number of AND gates to a given  
 617 node of the graph without affecting its behavior; we only have to make sure that we also add  
 618 fixed node neighbors to restore the node's balance to the original value.

619 **Join gadget.** The join gadget consists of a central node  $C$ , and of  $p$  distinct 2-group *starter*  
 620 *gadgets* of alternating color (we assume  $p$  to be even). Each starter gadget consists of two  
 621 groups  $A_i$  and  $B_i$ , both of size 2 (with  $i \in \{1, 2, \dots, p\}$ ). The two groups are connected to  
 622 each other, and  $A_i$  has a further edge to the input node  $v_i$ , and two fixed nodes of the same  
 623 color as its own. Finally, all  $B_i$  are connected to a central node  $C$ , which is in turn connected  
 624 to an output node  $v$ . Node  $C$  also has two further fixed black connections.

625 Initially,  $A_i$  for odd  $i$  values,  $B_i$  for even  $i$  values,  $v_i$  for even  $i$  and node  $C$  are colored  
 626 white; the remaining nodes are colored black. Nodes  $A_i$  have an initial balance of 1, nodes  
 627  $B_i$  have an initial balance of 1 or 3 (depending on parity), and  $C$  has an initial balance of 3.

628 Every time after  $v$  switches, the balance of  $C$  returns to its initial value of 3, so the  
 629 switching of the next input node will trigger the same process through the next starter  
 630 gadget.

631 **Fork gadget.** The fork gadget consists of  $q$  nodes  $F_1, \dots, F_q$  of alternating color, where we  
 632 assume  $q$  to be an odd number. All  $F_i$  are connected to the same input node  $v$ , and each to  
 633 a distinct output node  $v_i$ . They are also linked to each other, with  $F_i$  connected to  $F_{i+1}$  for  
 634 all  $i \in \{1, 2, \dots, q-1\}$ . Also, node  $F_1$  and  $F_q$  have a fixed neighbor colored black and white,  
 635 respectively (imitating the role of the nonexistent nodes  $F_0$  and  $F_{q+1}$ ). Finally, each  $F_i$  has  
 636 a further fixed neighbor of its original color. Initially,  $F_i$  is colored black for odd  $i$  and white  
 637 for even  $i$  values.

638 The balance of  $F_1$  and all white  $F_i$ -s is originally 1 in this setting, while the balance of  
 639 black  $F_i$ -s (except for  $F_1$ ) is 3. Hence when  $v$  first switches, only  $F_1$  will become switchable  
 640 (and switching it will propagate on through  $v_1$ ). The next time  $v$  switches, it switches back  
 641 to white; with  $v$  and  $F_1$  both white,  $F_2$  can now switch too. The pattern continues all the  
 642 way to  $F_q$ : as  $F_{i-1}$  has already been switched before, as soon as  $v$  switches back to the  
 643 color of  $F_i$ ,  $F_i$  becomes switchable, too, enabling propagation on the next branch. After  $v_i$   
 644 switches (and remains that way),  $F_i$  is not switchable anymore, since  $v_i$ ,  $F_{i-1}$  and its fixed  
 645 neighbor all have the opposite color.

646 Note that since each switching  $F_i$  increases the current balance of  $v$  from 1 to 3, we  
 647 need to switch two neighbors of  $v$  in each turn to make  $v$  switchable again. This is exactly  
 648 what happens when  $v$  is the base node of the rightmost relay in the chain: between every  
 649 consecutive switches of  $v$ , we switch both node  $U$  (by the recharging step) and node  $v_L$  (by  
 650 propagation through the chain) in the relay, and thus  $v$  becomes switchable again.

651 Note that since it is connected to the fork gadget, the rightmost rechargeable relay in the  
 652 chain is a modified one in the sense that its base node has not one, but  $q$  right-side neighbors,  
 653 colored in alternating fashion. However, this fact does not change its behavior at all. The  
 654 initial balance of the base node is still 1, and every time after  $v$  switches, it has one of its  
 655 neighbors  $F_i$  switching in the opposite direction. That has exactly the same effect as if the  
 656 right neighbor was simply a subsequent relay in the chain, triggered by  $v$ .

657 **On the whole construction.** For convenience, we assume in the construction that both  $m$   
 658 and  $r$  are even numbers.

659 Recharging systems and AND gates, as all other gadgets, are available in two color variants;  
 660 in the overview of the construction, we did not discuss which variant is used in which case.  
 661 However, the current state of each relay in each round is straightforward to calculate, so the  
 662 necessary color of all recharging systems and AND gates can easily be determined.

663 Also, we have seen that AND gates are used to ensure that the given recharging or resetting  
 664 operations have completely been executed. In order to achieve this, in case of the first systems  
 665 (which recharge relays), the input edges of the gates can be connected to the upper nodes of  
 666 the corresponding relays, since that is the last node to switch in the sequence. In case of the  
 667 systems that reset relays, the aim is only to switch the corresponding recharge node of the  
 668 relay, so we can connect the gates to the recharge nodes.

669 However, as each AND gate belongs to a certain branch of the construction, we also have  
 670 to ensure that the AND gate is only activated when the propagation reaches this branch,  
 671 and stays inactive as long as previous branches are being processed. Therefore, besides the  
 672 specified nodes in the relays, the final input node of the AND gate is the node which was  
 673 used to enable the recharging system in question (node  $v$  of Figure 5). This way, the gates  
 674 ensure that *after* the recharging system is activated, propagation only continues if all the  
 675 resulting switches were executed.

## 676 Generalization to $\omega(1)$ colors

677 One can observe that in the construction of Section 5, except for nodes  $A$  in the AND gates,  
 678 all nodes in the graph have a degree of  $O(\sqrt{n})$ . We can slightly modify the construction and  
 679 replace each of these AND gates with two levels of such gates, with  $\Theta(\sqrt{n})$  distinct gates on  
 680 the first level (each with  $\Theta(\sqrt{n})$  input nodes), and a final gate that connects the outputs of  
 681 these first-level gates. This gives us a construction with the same properties, but a maximum  
 682 degree of  $O(\sqrt{n})$ .

683 This allows us to generalize the lower bound of  $\Omega(n^{\frac{3}{2}})$  to the case of not only  $O(1)$ , but  
 684 up to  $O(\sqrt{n})$  colors. The technique for this is the same as in the case of  $O(1)$  colors: we  
 685 add a multipartite graph colored with the additional colors, and connect each of its nodes to  
 686 each original node. With  $\Delta = O(\sqrt{n})$  established, it suffices to have  $\Theta(\sqrt{n})$  nodes in each of  
 687 the color classes. Therefore, using only  $\Theta(n)$  additional nodes, we can extend the graph by a  
 688 multipartite graph on  $\Theta(\sqrt{n})$  color classes, each consisting of only  $\Theta(\sqrt{n})$  nodes.

## 689 **C** Notes on simulations

690 Due to its complexity, we have also verified the correctness of the non-recursive construction  
 691 of Section 5 through implementing it and running a simulation of the minority process. Note  
 692 that in general, it is difficult to simulate a minority process in a benevolent model, since all  
 693 possible switching sequences would have to be examined to find the one with the smallest  
 694 number of steps.

695 Fortunately, the task is significantly simpler in our case, due to the properties of the  
 696 construction. The key observation in our graph is that whenever propagation is split into  
 697 multiple parallel threads (that is, when there are multiple switchable nodes at the same  
 698 time), then propagation on any of these threads does not influence propagation on other  
 699 threads at all. Specifically, the nodes on separate threads do not have common neighbors  
 700 except for the beginning and end of such threads; i.e. when a switching node splits the  
 701 propagation to multiple threads, or when threads are joined in an AND-*like* fashion, meaning

702 that a common neighbor only becomes switchable when propagation has been finished in  
 703 all of the threads. This implies that throughout the process, these threads can be handled  
 704 completely independently from each other, and the order in which they are processed is  
 705 irrelevant. Note that this is also the property of the construction which ensures that the set  
 706 of switchable nodes is an independent set in any state.

707 If we exploit this property, the process can be simulated easily by always choosing an  
 708 arbitrary one of the switchable nodes in the graph, knowing that the choice of nodes will not  
 709 influence the outcome. To verify correctness in such a simulation, we only have to check that  
 710 in each step of the process, the set of nodes that become switchable is exactly the set of nodes  
 711 determined by the analysis. Note that the opposite does not happen in our construction:  
 712 the switching of a node never makes another switchable node unswitchable (this would also  
 713 contradict the property that switchable nodes form an independent step in any state).

714 When examining concrete instances of our construction, we used the parameter  $r$  as the  
 715 input to determine the size of the instance. For a given input value of  $r$  (always an even  
 716 number), we have chosen  $m = 2 \cdot (r - 1)^2$ , which fits our preconditions on both magnitudes  
 717 and parity. All other details of the construction are already determined above; the only  
 718 additional thing to note is that whenever different gadgets are connected through a chain of  
 719 simple relays, we always use the smallest possible such chain in the implementation.

720 The simulations verified that the analysis of the construction is correct, and thus stabiliz-  
 721 ation time is indeed  $\Omega(n^{3/2})$  in model B. Table 1 illustrates the number of steps for some  
 722 choices  $r$ , along with the resulting number of nodes in the construction. One can observe  
 723 that the number of steps indeed grows superlinearly in  $n$ .

Input ( $r$ )	Nodes ( $n$ )	Steps
2	99	112
4	469	772
8	1 929	5 884
16	7 729	47 404
24	17 369	161 372
30	27 119	316 568
40	48 169	754 108
60	108 269	2 559 188
80	192 369	6 084 268
100	300 469	11 905 348
120	432 569	20 598 428

■ **Table 1** Number of steps on some specific graphs