# Symbolic Approximation of Weighted Timed Games

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#### 10 – Abstract

Weighted timed games are zero-sum games played by two players on a timed automaton equipped 11 with weights, where one player wants to minimise the accumulated weight while reaching a target. 12 13 Weighted timed games are notoriously difficult and quickly undecidable, even when restricted to non-negative weights. For non-negative weights, the largest class that can be analysed has been 14 introduced by Bouyer, Jaziri and Markey in 2015. Though the value problem is undecidable, the 15 16 authors show how to approximate the value by considering regions with a refined granularity. In this work, we extend this class to incorporate negative weights, allowing one to model energy 17 for instance, and prove that the value can still be approximated, with the same complexity. In 18 addition, we show that a symbolic algorithm, relying on the paradigm of value iteration, can be 19 used as an approximation scheme on this class. 20

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#### 1 Introduction 24

The design of programs verifying some real-time specifications is a notoriously difficult prob-25 lem, because such programs must take care of delicate timing issues, and are difficult to 26 debug a posteriori. One research direction to ease the design of real-time software is to 27 automatise the process. The situation may usually be modelled into a timed game, played 28 by a *controller* and an antagonistic *environment*: they act, in a turn-based fashion, over a 29 timed automaton [2], namely a finite automaton equipped with real-valued variables, called 30 clocks, evolving with a uniform rate. A simple, yet realistic, objective for the controller is to 31 reach a target location. We are thus looking for a *strategy* of the controller, that is a recipe 32 dictating how to play so that the target is reached no matter how the environment plays. 33 Reachability timed games are decidable [4], and EXPTIME-complete [19]. 34

Weighted extensions of these games have been considered in order to measure the quality 35 of the winning strategy for the controller [9, 1]: when the controller has a winning strategy 36 in a given reachability timed game, the quantitative version of the game helps choosing a 37 good one with respect to some metrics. This means that the game now takes place over a 38 weighted (or priced) timed automaton [5, 3], where transitions are equipped with weights, 39 and locations with rates of weights (the cost is then proportional to the time spent in this 40 location, with the rate as proportional coefficient). While solving weighted timed automata 41



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has been shown to be PSPACE-complete [6] (i.e. the same complexity as the non-weighted version), weighted timed games are known to be undecidable [12]. This has led to many restrictions in order to regain decidability, the first and most interesting one being the class of strictly non-Zeno cost with only non-negative weights (in transitions and locations) [9]: this hypothesis requires that every execution of the timed automaton that follows a cycle of the region automaton has a weight far from 0 (in interval  $[1, +\infty)$ , for instance).

Negative weights are crucial when one wants to model energy or other resources that 48 can grow or decrease during the execution of the system to study. In [16], we have recently 49 extended the strictly non-Zeno cost restriction to weighted timed games in the presence 50 of negative weights in transitions and/or locations. We have described there the class of 51 divergent weighted timed games where each execution that follows a cycle of the region 52 automaton has a weight far from 0, i.e. in  $(-\infty, -1] \cup [1, +\infty)$ . We were able to obtain 53 a doubly-exponential-time algorithm to compute the values and almost-optimal strategies, 54 while deciding the divergence of a weighted timed game is PSPACE-complete. These com-55 plexity results match the ones that could be obtained in the non-negative case from [9, 1]. 56

The techniques used to obtain these results cannot be extended if the conditions are 57 slightly relaxed. For instance, if we add the possibility for an execution of the timed auto-58 maton following a cycle of the region automaton to have weight exactly  $\theta$ , the decision 59 problem is known to be undecidable [10], even with non-negative weights only. For this 60 extension, in the presence of non-negative weights only, it has been proposed an approxim-61 ation scheme to compute arbitrarily close estimates of the optimal value [10]. To this end, 62 the authors consider regions with a refined granularity so as to control the precision of the 63 approximation. In this work, our contribution is two-fold: first, we extend the class con-64 sidered in [10] to the presence of negative weights; second, we show that the approximation 65 can be obtained using a symbolic computation, based on the paradigm of value iteration. 66

More precisely, we define the class of *almost-divergent weighted timed games* where, for 67 each strongly connected component (SCC) of the region automaton, executions following 68 a cycle of this SCC have a weight either all in  $(-\infty, -1] \cup \{0\}$ , or all in  $\{0\} \cup [1, +\infty)$ . 69 In contrast, the *divergent* condition is equivalent to the same property on the strongly 70 connected components, but without the presence of singleton  $\{0\}$ . Given an almost-divergent 71 weighted timed game, an initial configuration c and a threshold  $\varepsilon$ , we compute a value that 72 we guarantee to be  $\varepsilon$ -close to the optimal value when the play starts from c. Moreover, 73 deciding if a weighted timed game is almost-divergent is a PSPACE-complete problem. 74

In order to approximate almost-divergent weighted timed games, we first adapt the approximation scheme of [10] to our setting. At the very core of their scheme is the notion of *kernels* that collect all cycles of weight exactly 0 in the game. Then, a semi-unfolding of the game (in which kernels are not unfolded) of bounded depth is shown to be equivalent to the original game. Adapting this scheme to negative weights requires to address new issues:

The definition and the approximation of these kernels is much more intricate in our setting (see Sections 3 and 5). Indeed, with only non-negative weights, a cycle of weight 0 only encounters locations and transitions with weight 0. It is no longer the case with arbitrary weights, both for discrete weights on transitions (that could alternate between weight +1 and -1, e.g.) and continuous rates on locations: for this continuous part, this requires to keep track of the real-time dynamics of the game.

Some valuations may have value  $-\infty$ . While it is undecidable in general whether a configuration has value  $-\infty$  (see Appendix A.1), we prove that it is decidable for almostdivergent weighted timed games (see Lemma 8).

<sup>89</sup> — The identification of an adequate bound to define an equivalent semi-unfolding of bounded

depth is more difficult in our setting, as having guarantees on weight accumulation is 90 harder (we can lose accumulated weight). We deal with this by evaluating how large the 91 value of a configuration can be, provided it is not infinite. This is presented in Section 4. 92 We also develop, in Section 6, a second approximation schema, more symbolic than [10], 93 in the sense that it avoids the a priori refinement of regions. Instead, all computations 94 are performed in a symbolic way using the techniques developed in [1]. This allows to 95 mutualise as much as possible the different computations: comparing these schemas with 96 the evaluation of MDPs or quantitative games like mean-payoff or discounted-payoff, it is 97 the same improvement as the use of *value iteration* techniques instead of techniques based 98 on the unfolding of the model into a finite tree that contains many times the same location. 99 Due to lack of space, omitted proofs can be found in the appendix. 100

# <sup>101</sup> 2 Weighted timed games

Clocks, guards and regions. We let X be a finite set of variables called clocks. A 102 valuation of clocks is a mapping  $\nu: X \to \mathbb{R}_{\geq 0}$ . For a valuation  $\nu, d \in \mathbb{R}_{\geq 0}$  and  $Y \subseteq X$ , we 103 define the valuation  $\nu + d$  as  $(\nu + d)(x) = \nu(x) + d$ , for all  $x \in X$ , and the valuation  $\nu[Y := 0]$ 104 as  $(\nu[Y := 0])(x) = 0$  if  $x \in Y$ , and  $(\nu[Y := 0])(x) = \nu(x)$  otherwise. The valuation **0** 105 assigns 0 to every clock. A guard on clocks of X is a conjunction of atomic constraints of 106 the form  $x \bowtie c$ , where  $\bowtie \in \{\leq, <, =, >, \geq\}$  and  $c \in \mathbb{Q}$  (we allow for rational coefficients 107 as we will need to refine the granularity in the following). Guard  $\overline{g}$  is the closed version of 108 guard q where every open constraint x < c or x > c is replaced by its closed version  $x \leq c$ 109 or  $x \ge c$ . A valuation  $\nu: X \to \mathbb{R}_{\ge 0}$  satisfies an atomic constraint  $x \bowtie c$  if  $\nu(x) \bowtie c$ . The 110 satisfaction relation is extended to all guards g naturally, and denoted by  $\nu \models g$ . We let 111 Guards(X) denote the set of guards over X. 112

We rely on the crucial notion of regions, as introduced in the seminal work on timed automata [2]: a region is a set of valuations, that are all time-abstract bisimilar. We will also need some refinement of regions, with respect to a granularity 1/N, with  $N \in \mathbb{N}$ . Formally, with respect to the set X of clocks and a constant M, a 1/N-region r is a subset of valuations characterised by the vector  $(\iota_x)_{x\in X} = (\min(MN, \lfloor \nu(x)N \rfloor))_{x\in X} \in [0, MN]^X$  and the order of



fractional parts of  $\nu(x)N$ , given as a partition  $X = X_0 \uplus X_1 \uplus \cdots \uplus X_m$  of clocks: a valu-120 ation  $\nu$  is in this 1/N-region r if (i)  $\lfloor \nu(x)N \rfloor = \iota_x$ , for all clocks  $x \in X$ ; (ii)  $\nu(x) = 0$  for all 121  $x \in X_0$ ; (iii) all clocks  $x \in X_i \neq \emptyset$  verify that  $\nu(x)N$  have the same fractional part, for all 122  $1 \leq i \leq m$ . We denote by  $\operatorname{Reg}_N(X, M)$  the set of 1/N-regions, and we write  $\operatorname{Reg}(X, M)$  as 123 a shortcut for  $\operatorname{Reg}_1(X, M)$ . We recover the traditional notion of region for N = 1. E.g., the 124 figure on the right depicts regions  $\operatorname{Reg}(\{x, y\}, 2)$  as well as a their refinement  $\operatorname{Reg}_3(\{x, y\}, 2)$ . 125 For any integer guard g, either all valuations of a given 1/N-region satisfy g, or none of 126 them do. A 1/N-region r' is said to be a time successor of the 1/N-region r if there exist 127  $\nu \in r, \nu' \in r'$ , and d > 0 such that  $\nu' = \nu + d$ . Moreover, for  $Y \subseteq X$ , we let r[Y := 0] be 128 the 1/N-region where clocks of Y are reset. 129

Weighted timed games. A weighted timed game (WTG) is then a tuple  $\mathcal{G} = \langle L = L_{\text{Min}} \uplus L_{\text{Max}}, \Delta, \text{wt}, L_T, \text{wt}_T \rangle$  where  $L_{\text{Min}}$  and  $L_{\text{Max}}$  are finite disjoint subsets of locations belonging to Min and Max, respectively,  $\Delta \subseteq L \times \text{Guards}(X) \times 2^X \times L$  is a finite set of transitions, wt:  $\Delta \uplus L \to \mathbb{Z}$  is the weight function, associating an integer weight with each transition and location,  $L_T \subseteq L_{\text{Min}}$  is a subset of target locations for player Min, and wt<sub>T</sub>:  $L_T \times \mathbb{R}^X_{\geq 0} \to \mathbb{R}_{\infty}$  is a function mapping each target location and valuation of the clocks



**Figure 1** A weighted timed game. Locations belonging to Min (resp. Max) are depicted by circles (resp. squares). The target location is  $\ell_3$ , whose output weight function is null. It is easy to observe that location  $\ell_1$  (resp.  $\ell_5$ ) has value  $+\infty$  (resp.  $-\infty$ ). As a consequence, the value in  $\ell_4$  is determined by the edge to  $\ell_3$ , and depicted in blue on the picture below. In location  $\ell_2$ , the value associated with the transition to  $\ell_3$  is depicted in red, and the value in  $\ell_2$  is obtained as the minimum of these two curves. Observe the intersection in x = 2/3 requiring to refine the regions.

to a final weight of  $\mathbb{R}_{\infty} = \mathbb{R} \uplus \{-\infty, +\infty\}$  (possibly  $0, +\infty, \text{ or } -\infty$ ). The addition of target weights is not standard, but we will use it in the process of solving those games: anyway, it is possible to simply map each target location to the weight 0, allowing us to recover the standard definition. Without loss of generality, we suppose the absence of deadlocks except on target locations, i.e. for each location  $\ell \in L \setminus L_T$  and valuation  $\nu$ , there exists  $(\ell, g, Y, \ell') \in \Delta$  such that  $\nu \models g$ , and no transition starts in  $L_T$ .

The semantics of a WTG  $\mathcal{G}$  is defined in terms of a game played 142 on an infinite transition system whose vertices are configurations 143 of the WTG. A configuration is a pair  $(\ell, \nu)$  with a location and 144 a valuation of the clocks. Configurations are split into players 145 according to the location. A configuration is final if its location is 146 a target location of  $L_T$ . The alphabet of the transition system is 147 given by  $\mathbb{R}_{\geq 0} \times \Delta$  and will encode the delay that a player wants 148 to spend in the current location, before firing a certain transition. 149 For every delay  $d \in \mathbb{R}_{\geq 0}$ , transition  $\delta = (\ell, g, Y, \ell') \in \Delta$  and 150



valuation  $\nu$ , there is an edge  $(\ell, \nu) \xrightarrow{d, \delta} (\ell', \nu')$  if  $\nu + d \models g$  and  $\nu' = (\nu + d)[Y := 0]$ . The weight of such an edge e is given by  $d \times \operatorname{wt}(\ell) + \operatorname{wt}(\delta)$ . An example is depicted on Figure 1.

A finite play is a finite sequence of consecutive edges  $\rho = (\ell_0, \nu_0) \xrightarrow{d_0, \delta_0} (\ell_1, \nu_1) \xrightarrow{d_1, \delta_1} \cdots (\ell_k, \nu_k)$ . We denote by  $|\rho|$  the length k of  $\rho$ . The concatenation of two finite plays  $\rho_1$ and  $\rho_2$ , such that  $\rho_1$  ends in the same configuration as  $\rho_2$  starts, is denoted by  $\rho_1 \rho_2$ . We let  $\mathsf{FPlays}_{\mathcal{G}}$  be the set of all finite plays in  $\mathcal{G}$ , whereas  $\mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Min}}$  (resp.  $\mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Max}}$ ) denote the finite plays that end in a configuration of Min (resp. Max). A play is then a maximal sequence of consecutive edges (it is either infinite or it reaches  $L_T$ ).

A strategy for Min (resp. Max) is a mapping  $\sigma \colon \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Min}} \to \mathbb{R}_{\geq 0} \times \Delta$  (resp.  $\sigma \colon \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Max}} \to \mathbb{R}_{\geq 0} \times \Delta$ ) such that for all finite plays  $\rho \in \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Min}}$  (resp.  $\rho \in \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Max}}$ ) ending in non-159 160 target configuration  $(\ell, \nu)$ , there exists an edge  $(\ell, \nu) \xrightarrow{\sigma(\rho)} (\ell', \nu')$ . A play or finite play  $\rho =$ 161  $(\ell_0, \nu_0) \xrightarrow{d_0, \delta_0} (\ell_1, \nu_1) \xrightarrow{d_1, \delta_1} \cdots$  conforms to a strategy  $\sigma$  of Min (resp. Max) if for all k such 162 that  $(\ell_k, \nu_k)$  belongs to Min (resp. Max), we have that  $(d_k, \delta_k) = \sigma((\ell_0, \nu_0) \xrightarrow{d_0, \delta_0} \cdots (\ell_k, \nu_k))$ . 163 A strategy  $\sigma$  is *memoryless* if for all finite plays  $\rho, \rho'$  ending in the same configuration, we 164 have that  $\sigma(\rho) = \sigma(\rho')$ . For all strategies  $\sigma_{Min}$  and  $\sigma_{Max}$  of players Min and Max, respectively, 165 and for all configurations  $(\ell_0, \nu_0)$ , we let  $\mathsf{play}_{\mathcal{G}}((\ell_0, \nu_0), \sigma_{\mathsf{Max}}, \sigma_{\mathsf{Min}})$  be the outcome of  $\sigma_{\mathsf{Max}}$ 166 and  $\sigma_{Min}$ , defined as the only play conforming to  $\sigma_{Max}$  and  $\sigma_{Min}$  and starting in  $(\ell_0, \nu_0)$ . 167

<sup>168</sup> The objective of Min is to reach a target configuration, while minimising the accumu-

lated weight up to the target. Hence, we associate to every finite play  $\rho = (\ell_0, \nu_0) \xrightarrow{d_0, \delta_0}$ 169  $(\ell_1, \nu_1) \xrightarrow{d_1, \delta_1} \cdots (\ell_k, \nu_k)$  its cumulated weight, taking into account both discrete and con-170 tinuous costs:  $\mathsf{wt}_{\Sigma}(\rho) = \sum_{i=0}^{k-1} \mathsf{wt}(\ell_i) \times d_i + \mathsf{wt}(\delta_i)$ . Then, the weight of a play  $\rho$ , denoted by 171  $\mathsf{wt}_{\mathcal{G}}(\rho)$ , is defined by  $+\infty$  if  $\rho$  is infinite (does not reach  $L_T$ ), and  $\mathsf{wt}_{\Sigma}(\rho) + \mathsf{wt}_T(\ell_T, \nu)$  if it 172 ends in  $(\ell_T, \nu)$  with  $\ell_T \in L_T$ . Then, for all locations  $\ell$  and valuation  $\nu$ , we let  $\mathsf{Val}_{\mathcal{G}}(\ell, \nu)$  be 173 the value of  $\mathcal{G}$  in  $(\ell, \nu)$ , defined as  $\mathsf{Val}_{\mathcal{G}}((\ell, \nu)) = \inf_{\sigma_{\mathsf{Min}}} \sup_{\sigma_{\mathsf{Max}}} \mathsf{wt}_{\mathcal{G}}(\mathsf{play}((\ell, \nu), \sigma_{\mathsf{Max}}, \sigma_{\mathsf{Min}}))$ , 174 where the order of the infimum and supremum does not matter, since WTGs are known to 175 be determined<sup>1</sup>. We say that a strategy  $\sigma_{\mathsf{Min}}^{\star}$  of Min is  $\varepsilon$ -optimal if, for all  $(\ell, \nu)$ , and all 176 strategies  $\sigma_{Max}$  of Max, wt<sub>*G*</sub>(play(( $\ell, \nu$ ),  $\sigma_{Max}, \sigma_{Min}^{\star}$ ))  $\leq Val_{\mathcal{G}}(\ell, \nu) + \varepsilon$ . It is said optimal if this 177 holds for  $\varepsilon = 0$ . A symmetric definition holds for optimal strategies of Max. If the game is 178 clear from the context, we may drop the index  $\mathcal{G}$  from all previous notations. 179

As usual in related work [1, 9, 10], we assume that the starting WTGs have guards 180 where all constants are integers, and all clocks are bounded, i.e. there is a constant  $M \in \mathbb{N}$ 181 such that every transition of the WTG is equipped with a guard g such that  $\nu \models g$  implies 182  $\nu(x) \leq M$  for all clocks  $x \in X$ . We denote by  $w_{\max}^L$  (resp.  $w_{\max}^{\Delta}$ ,  $w_{\max}^e$ ) the maximal weight 183 in absolute values of locations (resp. of transitions, edges) of  $\mathcal{G}$ , i.e.  $w_{\max}^L = \max_{\ell \in L} |\mathsf{wt}(\ell)|$ 184 (resp.  $w_{\max}^{\Delta} = \max_{\delta \in \Delta} |wt(\delta)|, w_{\max}^{e} = M w_{\max}^{L} + w_{\max}^{\Delta}$ ). For technical reasons that will 185 become clear later, we also assume that the output weight functions are piecewise linear 186 with a finite number of pieces and are continuous on each region. 187

**Region and corner abstractions.** The region automaton, or region game,  $\mathcal{R}_N(\mathcal{G})$  (ab-188 breviated as  $\mathcal{R}(\mathcal{G})$  when N = 1 of a game  $\mathcal{G} = \langle L = L_{\mathsf{Min}} \uplus L_{\mathsf{Max}}, \Delta, \mathsf{wt}, L_T, \mathsf{wt}_T \rangle$  is the 189 WTG with locations  $S = L \times \text{Reg}_N(X, M)$  and all transitions  $((\ell, r), g'', Y, (\ell', r'))$  with 190  $(\ell, g, Y, \ell') \in \Delta$  such that the model of guard g'' (i.e. all valuations  $\nu$  such that  $\nu \models g''$ ) is a 191 1/N-region r'', time successor of r such that r'' satisfies the guard g, and r' = r''[Y := 0]. 192 Distribution of locations to players, final locations and weights are taken according to  $\mathcal{G}$ . 193 We call *path* a finite or infinite sequence of transitions in this automaton, and we denote by 194  $\pi$  the paths. A play  $\rho$  in  $\mathcal{G}$  is projected on a path  $\pi$  in  $\mathcal{R}_N(\mathcal{G})$ , by replacing actual valuations 195 by the 1/N-regions containing them: we say that  $\rho$  follows the path  $\pi$ . It is important to 196 notice that, even if  $\pi$  is a *cycle* (i.e. starts and ends in the same location of the region game), 197 there may exist plays following it in  $\mathcal{G}$  that are not cycles, due to the fact that regions are 198 sets of valuations. By projecting away the region information of  $\mathcal{R}_N(\mathcal{G})$ , we simply obtain: 199

# ▶ Lemma 1. For all $\ell \in L$ , 1/N-regions r, and $\nu \in r$ , $\mathsf{Val}_{\mathcal{G}}(\ell, \nu) = \mathsf{Val}_{\mathcal{R}_N(\mathcal{G})}((\ell, r), \nu)$ .

On top of regions, we will need the corner-point abstraction techniques introduced in [8]. 201 A valuation v is said to be a corner of a 1/N-region r, if it belongs to the topological 202 closure  $\overline{r}$  and has coordinates multiple of 1/N ( $v \in (1/N)\mathbb{N}^X$ ). We call corner state a 203 triple  $(\ell, r, v)$  that contains information about a location  $(\ell, r)$  of the region-game  $\mathcal{R}_N(\mathcal{G})$ , 204 and a corner v of the 1/N-region r. Every region has at most |X|+1 corners. We now define 205 the corner-point abstraction  $\mathcal{C}_N(\mathcal{G})$  of a WTG  $\mathcal{G}$  as the WTG obtained as a refinement of 206  $\mathcal{R}_N(\mathcal{G})$  where guards on transitions are enforced to stay on one of the corners of the current 207 1/N-region: the locations of  $\mathcal{C}_N(\mathcal{G})$  are all corner states of  $\mathcal{R}_N(\mathcal{G})$ , associated to each player 208 accordingly, and transitions are all  $((\ell, r, v), g'', Y, (\ell', r', v'))$  such that  $t = ((\ell, r), g, Y, (\ell', r'))$ 209 is a transition of  $\mathcal{R}_N(\mathcal{G})$  such that the model of guard g'' is a corner v'' satisfying the 210 guard  $\overline{g}$  (recall that  $\overline{g}$  is the closed version of g), v' = v''[Y := 0], and there exist two 211

<sup>&</sup>lt;sup>1</sup> The determinacy result is stated in [13] for WTG (called priced timed games) with one clock, but the proof does not use the assumption on the number of clocks.

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valuations  $\nu \in r$ ,  $\nu' \in r'$  such that  $((\ell, r), \nu) \xrightarrow{d', t} ((\ell', r'), \nu')$  for some  $d' \in \mathbb{R}_{\geq 0}$  (this constraint must be added to ensure that the transition between corners is not spurious). Because of this closure operation, we must also define properly the final weight function: we simply define it over the only valuation v reachable in location  $(\ell, r, v)$  (with  $\ell \in L_T$ ) by wt<sub>T</sub> $((\ell, r, v), v) = \lim_{\nu \to v, \nu \in r} \operatorname{wt}_T(\ell, \nu)$  (the limit is well defined since wt<sub>T</sub> is piecewise linear with a finite number of pieces on region r).

The WTG  $\mathcal{C}_N(\mathcal{G})$  can be seen as a weighted game (with final weights), i.e. a WTG 218 without clocks (which means that there are only weights on transitions), by removing 219 guards, resets and rates of locations, and replacing the weights of transitions by the ac-220 tual weight of jumping from one corner to another: for instance, the previous transition 221  $(((\ell, r), v), q'', Y, ((\ell', r'), v'))$  becomes an edge from  $((\ell, r), v)$  to  $((\ell', r'), v')$  with weight 222  $d \times \mathsf{wt}(\ell) + \mathsf{wt}(\ell)$  (for all possible values of d, which requires to allow for multi-edges<sup>2</sup>). 223 Note that delay d is necessarily a rational of the form  $\alpha/N$  with  $\alpha \in \mathbb{N}$ , since it must relate 224 corners of 1/N-regions. In particular, this proves that the cumulated weight  $\mathsf{wt}_{\Sigma}(\rho)$  of a 225 finite play  $\rho$  in  $\mathcal{C}_N(\mathcal{G})$  is indeed a rational number with denominator N. 226

We will call *corner play* a play  $\rho$  in the corner-point abstraction  $C_N(\mathcal{G})$ : it can also be interpreted as a timed execution in  $\mathcal{G}$  where all guards are closed (as explained in the definition before). It straightforwardly projects on a finite path  $\pi$  in the region game  $\mathcal{R}_N(\mathcal{G})$ : in this case, we say again that  $\rho$  follows  $\pi$ . Corner plays allow one to obtain faithful information on the plays that follow the same path:

**Lemma 2.** If  $\pi$  is a finite path in  $\mathcal{R}_N(\mathcal{G})$ , the set  $\{\mathsf{wt}_{\Sigma}(\rho) \mid \rho \text{ finite play following } \pi\}$ is an interval bounded by the minimum and the maximum values of the set  $\{\mathsf{wt}_{\Sigma}(\rho) \mid \rho \text{ finite corner play of } C_N(\mathcal{G}) \text{ following } \pi\}$ .

Value iteration. We will rely on the value iteration algorithm described in [1] for a WTG  $\mathcal{G}$ . If V represents a value function—i.e. a mapping from configurations of  $L \times \mathbb{R}^X_{\geq 0}$  to a value in  $\mathbb{R}_{\infty}$ —we denote by  $V_{\ell,\nu}$  the image  $V(\ell,\nu)$ , for better readability, and by  $V_{\ell}$  the function mapping each valuation  $\nu$  to  $V_{\ell,\nu}$ . One step of the game is summarised in the following operator  $\mathcal{F}$  mapping each value function V to a value function  $V' = \mathcal{F}(V)$  defined by  $V'_{\ell,\nu} = \operatorname{wt}_T(\ell,\nu)$  if  $\ell \in L_T$ , and otherwise

$$V_{\ell,\nu}' = \begin{cases} \sup_{(\ell,\nu) \xrightarrow{d,\delta} (\ell',\nu')} \left[ d \times \mathsf{wt}(\ell) + \mathsf{wt}(\delta) + V_{\ell',\nu'} \right] & \text{if } \ell \in L_{\mathsf{Max}} \\ \inf_{(\ell,\nu) \xrightarrow{d,\delta} (\ell',\nu')} \left[ d \times \mathsf{wt}(\ell) + \mathsf{wt}(\delta) + V_{\ell',\nu'} \right] & \text{if } \ell \in L_{\mathsf{Min}} \end{cases}$$
(1)

where  $(\ell, \nu) \xrightarrow{d,\delta} (\ell', \nu')$  ranges over valid edges in  $\mathcal{G}$ . Then, starting from  $V^0$  mapping every configuration to  $+\infty$ , except for the target mapped to  $\mathsf{wt}_T$ , we let  $V^i = \mathcal{F}(V^{i-1})$  for all i > 0. The value function  $V^i$  represents the value  $\mathsf{Val}^i_{\mathcal{G}}$ , which is intuitively what Min can guarantee when forced to reach the target in at most i steps.

More formally, we define  $\operatorname{wt}_{\mathcal{G}}^{i}(\rho)$  the weight of a maximal play  $\rho$  at horizon i, as  $\operatorname{wt}_{\mathcal{G}}(\rho)$ if  $\rho$  reaches a target state in at most i steps, and  $+\infty$  otherwise. Using this alternative definition of the weight of a play, we can obtain a new game value  $\operatorname{Val}_{\mathcal{G}}^{i}(\ell,\nu) =$  $\operatorname{inf}_{\sigma_{\operatorname{Min}}} \sup_{\sigma_{\operatorname{Max}}} \operatorname{wt}_{\mathcal{G}}^{i}(\operatorname{play}((\ell,\nu),\sigma_{\operatorname{Max}},\sigma_{\operatorname{Min}}))$ . Then, if  $\mathcal{G}$  is a tree of depth d,  $V^{i}=\operatorname{Val}_{\mathcal{G}}$  if  $i \geq d$ . The mappings  $V_{\ell}^{0}$  are piecewise linear for all  $\ell$ , and  $\mathcal{F}$  preserves piecewise linearity over regions, so all iterates  $V_{\ell}^{i}$  are piecewise linear with a finite number of pieces. In [1],

 $<sup>^{2}</sup>$  The only case where several edges could link two corners using the same transition is when all clocks are reset in Y, in which case there is a choice for delay d.

it is proved that  $V_{\ell}^i$  has a number of pieces (and can be computed within a complexity) exponential in *i* and in the size of  $\mathcal{G}$  when wt<sub>T</sub> = 0. This result can be extended to handle negative weights in  $\mathcal{G}$  and output weights wt<sub>T</sub>  $\neq 0$ .

**Problems.** We consider the value problem that asks, given a WTG  $\mathcal{G}$ , a location  $\ell$  and a threshold  $\alpha \in \mathbb{Z} \cup \{-\infty, +\infty\}$ , to decide whether  $\mathsf{Val}_{\mathcal{G}}(\ell, \mathbf{0}) \leq \alpha$ . In the context of timed games, optimal strategies may not exist. We generally focus on finding  $\varepsilon$ -optimal strategies, that guarantee the optimal value, up to a small error  $\varepsilon$ . Moreover, when the value problem is undecidable, we also consider the *approximation problem* that consists, given a precision  $\varepsilon \in \mathbb{Q}_{>0}$ , in computing an  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{G}}(\ell, \mathbf{0})$ .

**Related work.** In the one-player case, computing the optimal value and an  $\varepsilon$ -optimal 261 strategy for weighted timed automata is known to be PSPACE-complete [6]. In the two-262 player case, the value problem of WTGs (also called priced timed games in the literature) is 263 undecidable with 3 clocks [12, 10], or even 2 clocks in the presence of negative weights [15] 264 (for the existence problem asking if a strategy of player Min can guarantee a given threshold). 265 To obtain decidability, one possibility is to limit the number of clocks to 1: then, there is 266 an exponential-time algorithm to compute the value as well as  $\varepsilon$ -optimal strategies in the 267 presence of non-negative weights only [7, 20, 17], whereas the problem is only known to be 268 PTIME-hard. A similar result can be lifted to arbitrary weights, under restrictions on the 269 resets of the clock in cycles [13]. 270

The other possibility to obtain a decidability result [9, 16] is to enforce a semantical property of divergence (originally called strictly non-Zeno cost): it asks that every play following a cycle in the region automaton has weight far from 0. It allows the author to prove that playing for only a bounded number of steps is equivalent to the original game, which boils down to the problem of computing the value of a tree-shaped weighted timed game  $\mathcal{G}$  using the value iteration algorithm.

Other objectives, not directly related to optimal reachability, have been considered in [11] for weighted timed games, like mean-payoff and parity objectives. In this work, the authors manage to solve these problems for the so-called class of  $\delta$ -robust WTGs that they introduce. This class includes the class we consider, but is decidable in 2-EXPSPACE.

Our results. A cycle  $\pi$  of  $\mathcal{R}(\mathcal{G})$  is said to be a positive cycle (resp. a 0-cycle, or a negative cycle) if every finite play  $\rho$  following  $\pi$  satisfies  $\mathsf{wt}_{\Sigma}(\rho) \ge 1$  (resp.  $\mathsf{wt}_{\Sigma}(\rho) = 0$ , or  $\mathsf{wt}_{\Sigma}(\rho) \le$ -1). A strongly connected component (SCC) S of  $\mathcal{R}(\mathcal{G})$  is said to be positive (resp. negative) if every cycle  $\pi \in S$  is positive (resp. negative). An SCC S of  $\mathcal{R}(\mathcal{G})$  is said to be nonnegative (resp. non-positive) if every play  $\rho$  following a cycle in S satisfies either  $\mathsf{wt}_{\Sigma}(\rho) \ge 1$ or  $\mathsf{wt}_{\Sigma}(\rho) = 0$  (resp. either  $\mathsf{wt}_{\Sigma}(\rho) \le -1$  or  $\mathsf{wt}_{\Sigma}(\rho) = 0$ ).

**Definition 3.** A WTG  $\mathcal{G}$  is divergent (as defined in [16]) if every SCC of  $\mathcal{R}(\mathcal{G})$  is either positive or negative. As a generalisation, a WTG  $\mathcal{G}$  is almost-divergent when every SCC of  $\mathcal{R}(\mathcal{G})$  is either non-negative or non-positive.

In [16], we showed that we can decide in 2-EXPTIME the value problem for divergent WTGs. Unfortunately, it is shown in [10] that this problem is undecidable for almostdivergent WTGs (already with non-negative weights only, where almost-divergent WTGs are called *simple*). They propose a solution to the approximation problem, again with non-negative weights only. Our main result is the following extension of their result:

▶ **Theorem 4.** Given an almost-divergent WTG  $\mathcal{G}$ , a location  $\ell$  and  $\varepsilon \in \mathbb{Q}_{>0}$ , we can compute an  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{G}}(\ell, \mathbf{0})$  in complexity doubly-exponential in the size of  $\mathcal{G}$  and polynomial in  $1/\varepsilon$ . Moreover, deciding if a WTG is almost-divergent is PSPACE-complete.

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**Figure 2** Static approximation schema: SCC decomposition of  $\mathcal{R}(\mathcal{G})$ , semi-unfolding of an SCC, corner-point abstraction for the kernels

To obtain this result, we follow an approximation schema that we now outline. First, we will always reason on the region game  $\mathcal{R}(\mathcal{G})$  of the almost-divergent WTG  $\mathcal{G}$ . The goal is to compute an  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{R}(\mathcal{G})}(s_0, \mathbf{0})$  for some state  $s_0 = (\ell_0, r_0)$ , with  $r_0$  the region where every clock value is 0. As already recalled, techniques of [1] allows one to compute the (exact) values of a WTG played on a finite tree, using operator  $\mathcal{F}$ . The idea is thus to decompose as much as possible the game  $\mathcal{R}(\mathcal{G})$  in a WTG over a tree. First, we decompose the region game into SCCs (left of Figure 2).

During the approximation process, we must think about the final weight functions as the previously computed approximations of the values of SCCs below. We will keep as an invariant that final weight functions are piecewise linear functions with a finite number of pieces, and are continuous on each region.

For an SCC of  $\mathcal{R}(\mathcal{G})$  and an initial state  $s_0$  of  $\mathcal{R}(\mathcal{G})$  provided by the SCC decomposition, we show that the game on the SCC is equivalent to a game on a tree built from a semiunfolding (see middle of Figure 2) of  $\mathcal{R}(\mathcal{G})$  from  $s_0$  of finite depth, with certain nodes of the tree being *kernels*. These kernels are some parts of  $\mathcal{R}(\mathcal{G})$  that contain all cycles of weight 0.

▶ Remark. In a weighted-timed game, it is easy to detect the set of states with value +∞: these are all the states from which Min cannot ensure reachability of a target location  $\ell \in L_T$ with wt<sub>T</sub>( $\ell$ ) < +∞. It can therefore be computed by an attractor computation, and is indeed a property constant on each region. In particular, removing those states from  $\mathcal{R}(\mathcal{G})$  does not affect the value of any other state and can be done in complexity linear in  $|\mathcal{R}(\mathcal{G})|$ . We will therefore assume that the considered WTG have no configurations with value +∞.

#### **319 3** Kernels of an almost-divergent WTG

The approximation procedure described before uses the so-called *kernels* in order to group together all cycles of weight 0. We study those kernels and give a characterisation allowing computability. Contrary to the non-negative case, the situation is more complex in our arbitrary case, since weights of both locations and transitions may differ from 0 in the kernel. Moreover, it is not trivial (and may not be true in a non almost-divergent WTG) to know whether it is sufficient to consider only simple cycles, i.e. cycles without repetitions.

To answer these questions, let us first analyse the cycles of  $\mathcal{R}(\mathcal{G})$  that we will encounter. Since we are in an almost-divergent game, by Lemma 2, all cycles  $\pi = t_1 \cdots t_n$  of  $\mathcal{R}(\mathcal{G})$ (with  $t_1, \ldots, t_n$  transitions of  $\mathcal{R}(\mathcal{G})$ ) are either 0-cycles, positive cycles or negative cycles. Additionally, in an SCC S of  $\mathcal{R}(\mathcal{G})$ , we cannot find both positive and negative cycles by definition. Moreover, we can classify a cycle by looking only at the corner plays following it.

**Lemma 5.** A cycle  $\pi$  is a 0-cycle iff there exists a corner play  $\rho$  following  $\pi$  with wt<sub> $\Sigma$ </sub>( $\rho$ )=0.

An important result is that 0-cycles are stable by rotation. This is not trivial because plays following a cycle can start and end in different valuations, therefore changing the starting state of the cycle could a priori change the plays that follow it and their weights.

335 ► Lemma 6. Let π and π' be paths of  $\mathcal{R}(\mathcal{G})$ . Then, ππ' is a 0-cycle iff π'π is a 0-cycle.

Sketch of proof. This stems from a pumping argument on the corner plays following cycles. Indeed, there are finitely many corners, so by constructing a long enough play following an iterate of  $\pi'\pi$ , we can obtain a corner play that starts and ends in the same corner. This play can then be considered as a play following an iterate of  $\pi\pi'$ , which ensures that it has weight 0. This allows us to conclude because in an almost-divergent WTG, if  $(\pi\pi')^m$  is a 0-cycle then  $\pi\pi'$  is a 0-cycle.

We will now construct the kernel K as the subgraph of  $\mathcal{R}(\mathcal{G})$  containing all 0-cycles. Formally, let  $T_{\mathsf{K}}$  be the set of transitions of  $\mathcal{R}(\mathcal{G})$  belonging to a *simple* 0-cycle, and  $S_{\mathsf{K}}$  be the set of states covered by  $T_{\mathsf{K}}$ . We define the kernel K of  $\mathcal{R}(\mathcal{G})$  as the subgraph of  $\mathcal{R}(\mathcal{G})$ defined by  $S_{\mathsf{K}}$  and  $T_{\mathsf{K}}$ . Transitions in  $T \setminus T_{\mathsf{K}}$  with starting state in  $S_{\mathsf{K}}$  are called the output transitions of K. We define it using only simple 0-cycles in order to ensure its computability. However, we now show that this is of no harm, since the kernel contains exactly all the 0-cycles, which will be crucial in the approximation schema we present in Section 5.

#### **Proposition 7.** A cycle of $\mathcal{R}(\mathcal{G})$ is entirely in K if and only if it is a 0-cycle.

**Proof.** We prove that every 0-cycle is in K by induction on the length of the cycles. The 350 initialisation contains only cycles of length 1, that are in K by construction. If we consider 351 a cycle  $\pi$  of length n > 1, it is either simple or it can be rotated and decomposed into  $\pi' \pi''$ , 352  $\pi'$  and  $\pi''$  being smaller cycles. Let  $\rho$  be a corner play following  $\pi'\pi''$ . We denote by  $\rho'$  the 353 prefix of  $\rho$  following  $\pi'$  and  $\rho''$  the suffix following  $\pi''$ . It holds that  $\mathsf{wt}_{\Sigma}(\rho') = -\mathsf{wt}_{\Sigma}(\rho'')$ , and 354 in an almost-divergent SCC this implies  $\mathsf{wt}_{\Sigma}(\rho') = \mathsf{wt}_{\Sigma}(\rho'') = 0$ . Therefore, by Lemma 5 355 both  $\pi'$  and  $\pi''$  are 0-cycles, and they must be in K by induction hypothesis. Note that this 356 reasoning proves that every cycle contained in a longer 0-cycle is also a 0-cycle. 357

We now prove that every cycle in K is a 0-cycle. By construc-358 tion, every transition  $t \in T_{\mathsf{K}}$  is part of a simple 0-cycle. Thus, 359 to every transition  $t \in T_{\mathsf{K}}$ , we can associate a path  $\pi_t$  such that 360  $t\pi_t$  is a simple 0-cycle (rotate the simple cycle if necessary). We 361 can prove the following property by relying on another pumping 362 arguments on corners (see Lemma 17 in Appendix B): If  $t_1 \cdots t_n$ 363 is a path in K, then  $t_1 t_2 \cdots t_n \pi_{t_n} \cdots \pi_{t_2} \pi_{t_1}$  is a 0-cycle of  $\mathcal{R}(\mathcal{G})$ . 364 Now, if  $\pi$  is a cycle of  $\mathcal{R}(\mathcal{G})$  in K, there exists a cycle  $\pi'$  such 365 that  $\pi\pi'$  is a 0-cycle, therefore  $\pi$  is a 0-cycle. 366



#### <sup>367</sup> **4** Semi-unfolding of almost-divergent WTGs

Given an almost-divergent WTG  $\mathcal{G}$ , we describe the construction of its *semi-unfolding*  $\mathcal{T}(\mathcal{G})$ (as depicted in Figure 2), which is a WTG that has the same value as  $\mathcal{G}$ . Moreover, the SCCdecomposition of  $\mathcal{T}(\mathcal{G})$  is tree-shaped and each non-trivial SCC is a kernel. In the following, the depth of  $\mathcal{T}(\mathcal{G})$  refers to the depth of its SCC-decomposition. This construction crucially relies on the absence of states with value  $-\infty$ , so we explain how to deal with them:

**Lemma 8.** In an SCC of  $\mathcal{R}(\mathcal{G})$ , the set of configurations with value  $-\infty$  is a union of regions computable in time linear in the size of  $\mathcal{R}(\mathcal{G})$ .

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**Sketch of proof.** If the SCC is non-negative, the cumulated weight cannot decrease along a cycle, thus, the only way to obtain value  $-\infty$  is to jump in a final state with final weight  $-\infty$ . We can therefore compute this set of states with an attractor for Min.

If the SCC is non-positive, we let  $S_f^{\mathbb{R}}$  (resp.  $S_f^{-\infty}$ ) be the set of target states where wt<sub>T</sub> is bounded (resp. has value  $-\infty$ ). We also define  $T_f^{\mathbb{R}}$  (resp.  $T_f^{-\infty}$ ), the set of transitions of  $\mathcal{R}(\mathcal{G})$  whose end state belongs to  $S_f^{\mathbb{R}}$  (resp.  $S_f^{-\infty}$ ). Notice that the kernel cannot contain target states since they do not have outgoing transitions. We can prove that a configuration has value  $-\infty$  iff it belongs to a state where player Min can ensure the LTL formula on transitions:  $(G \neg T_f^{\mathbb{R}} \land \neg FG T_K) \lor F T_f^{-\infty}$ . The procedure to detect  $-\infty$  states thus consists of four attractor computations, which can be done in time linear in  $|\mathcal{R}(\mathcal{G})|$ .

We can now assume that no states of  $\mathcal{G}$  has value  $-\infty$ , and that the output weight function maps all configurations to  $\mathbb{R}$ . Since  $\mathsf{wt}_T$  is piecewise linear with finitely many pieces,  $\mathsf{wt}_T$  is bounded. Let  $\sup |\mathsf{wt}_T|$  denote the bound of  $|\mathsf{wt}_T|$ , ranging over all target configurations. We turn to the construction of the semi-unfolding  $\mathcal{T}(\mathcal{G})$  and prove:

▶ Proposition 9. Let  $\mathcal{G}$  be an almost-divergent WTG with initial state  $(\ell_0, r_0)$ . There exists a semi-unfolding  $\mathcal{T}(\mathcal{G})$  with initial state  $(\tilde{\ell}_0, r_0)$  such that for all  $\nu_0 \in r_0$ ,  $\mathsf{Val}_{\mathcal{G}}(\ell_0, \nu_0) =$  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$ . The depth of  $\mathcal{T}(\mathcal{G})$  is polynomial in  $|\mathcal{R}(\mathcal{G})|$ ,  $w_{\max}^e$  and  $\sup |\mathsf{wt}_T|$ .

**Sketch of proof.** We only build the semi-unfolded game  $\mathcal{T}(\mathcal{G})$  of an SCC of  $\mathcal{G}$  starting from 392 some initial state  $(\ell_0, r_0)$ , since it is then easy to glue all the semi-unfoldings together to get 393 the one of the full game. Since every configuration has finite value, we can prove that values 394 of the game are bounded by  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |wt_T|$ . As a consequence, we can find a bound 395  $\gamma$  linear in  $|\mathcal{R}(\mathcal{G})|$ ,  $w_{\max}^e$  and  $\sup |\mathsf{wt}_T|$  such that a play that visits some state outside the 396 kernel more than  $\gamma$  times has weight strictly above  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |\mathsf{wt}_T|$ , hence is useless 397 for value computation. This leads to considering the semi-unfolding  $\mathcal{T}(\mathcal{G})$  of  $\mathcal{G}$  (nodes in the 398 kernel are not unfolded, see Figure 2) such that each node not in the kernel is encountered 399 at most  $\gamma$  times along a branch. In particular, the depth of  $\mathcal{T}(\mathcal{G})$  is bounded by  $|\mathcal{R}(\mathcal{G})|\gamma$ . 400

# **5** Approximation of almost-divergent WTGs

**Approximation of kernels.** We start by approximating a kernel  $\mathcal{G}$  by extending the region-based approximation schema of [10]. In their setting, all runs in kernels had weight 0, allowing a simple reduction to a finite weighted game. In our setting, we have to approximate the timed dynamics of runs, and therefore resort to the corner-point abstraction (as shown in the right of Figure 2).

Since output weight functions are piecewise linear with a finite number of pieces and continuous on regions, they are K-Lipschitz-continuous<sup>3</sup>, for a given constant  $K \ge 0$ . We let  $\mathbf{B} = w_{\max}^L |L| |\text{Reg}(X, M)| + K$ .

Let N be an integer. Consider the game  $C_N(\mathcal{G})$  described in the preliminary section, with locations of the form  $(\ell, r, v)$  with v a corner of the 1/N-region r. Two plays  $\rho$  of  $\mathcal{G}$ and  $\rho'$  of  $C_N(\mathcal{G})$  are said to be 1/N-close if they follow the same path  $\pi$  in  $\mathcal{R}_N(\mathcal{G})$ . In particular, at each step the configurations  $(\ell, \nu)$  in  $\rho$  and  $(\ell', r', v')$  in  $\rho'$  (with v' a corner of the 1/N-region r') satisfy  $\ell = \ell'$  and  $\nu \in r'$ , and the transitions taken in both plays have the same discrete weights. Close plays have close weights, in the following sense:

<sup>&</sup>lt;sup>3</sup> The function wt<sub>T</sub> is said to be K-Lipschitz-continuous when  $|wt_T(s,\nu) - wt_T(s,\nu')| \leq K ||\nu - \nu'||_{\infty}$  for all valuations  $\nu, \nu'$ , where  $||v||_{\infty} = \max_{x \in X} |v(x)|$  is the  $\infty$ -norm of vector  $v \in \mathbb{R}^X$ . The function wt<sub>T</sub> is said to be Lipschitz-continuous if it is K-Lipschitz-continuous, for some K.

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<sup>416</sup> ► Lemma 10. For all 1/N-close plays ρ of G and ρ' of  $C_N(G)$ ,  $|wt_G(ρ)-wt_{C_N(G)}(ρ')| ≤ B/N$ .

In particular, if we start in configurations  $(\ell_0, \nu_0)$  of  $\mathcal{G}$ , and  $((\ell_0, r_0, v_0), v_0)$  of  $\mathcal{C}_N(\mathcal{G})$ , with  $\nu_0 \in r_0$ , since both players have the ability to stay 1/N-close all along the plays, a bisimulation argument permits to obtain that the values of the two games are also close in  $(\ell_0, \nu_0)$  and  $((\ell_0, r_0, v_0), v_0)$ :

<sup>421</sup> ► Lemma 11. For all locations  $\ell \in L$ , 1/N-regions  $r, \nu \in r$  and corners v of r,  $|Val_{\mathcal{G}}(\ell, \nu) - Val_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v), v)| \leq \mathbf{B}/N$ .

Using this result, picking N an integer larger than  $\mathbf{B}/\varepsilon$ , we can thus obtain  $|\mathsf{Val}_{\mathcal{G}}(\ell,\nu) - \mathsf{Val}_{\mathcal{G}}(\ell,\nu)|$ 423  $\mathsf{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v), v) | \leq \varepsilon$ . Recall that  $\mathcal{C}_N(\mathcal{G})$  can be considered as an untimed weighted game 424 (with reachability objective). Thus we can apply the result of [14], where it is shown that the 425 optimal values of such games can be computed in pseudo-polynomial time (i.e. polynomial 426 time with weights encoded in unary, instead of binary). We then define an  $\varepsilon$ -approximation 427 of  $\mathsf{Val}_{\mathcal{G}}$ , named  $\mathsf{Val}'_N$ , on each 1/N-region by interpolating the values of its 1/N-corners in 428  $\mathcal{C}_N(\mathcal{G})$  with a piecewise linear function: therefore, we can control the Lipschitz constant of 429 the approximated value for further use. 430

<sup>431</sup> ► Lemma 12.  $Val'_N$  is an ε-approximation of  $Val_G$ , that is piecewise linear with a finite <sup>432</sup> number of pieces and 2B-Lipschitz-continuous over regions.

Approximation of almost-divergent WTGs. We now explain how to approximate 433 the value of an almost-divergent WTG  $\mathcal{G}$ , thus proving Theorem 4. First, we compute a 434 semi-unfolding  $\mathcal{T}(\mathcal{G})$  as described in the previous section. Then we perform a bottom-up 435 computation of the approximation. As already recalled, techniques of [1] allow us to compute 436 exact values of a tree-shape WTG. In consequence, we know how to compute the value of a 437 non-kernel node of  $\mathcal{T}(\mathcal{G})$ , depending of the values of its children. There is no approximation 438 needed here, so that if all children are  $\varepsilon$ -approximation, we can compute an  $\varepsilon$ -approximation 439 of the node. Therefore, the only approximation lies in the kernels, and we explained before 440 how to compute arbitrarily close an approximation of a kernel's value. We crucially rely on 441 the fact that the value function is 1-Lipschitz-continuous<sup>4</sup>. This entails that imprecisions 442 will sum up along the bottom-up computations, as computing an  $\varepsilon$ -approximation of the 443 value of a game whose output weights are  $\varepsilon'$ -approximations yields an  $(\varepsilon + \varepsilon')$ -approximation. 444 Therefore we compute approximations with threshold  $\varepsilon' = \varepsilon/\alpha$  for kernels in  $\mathcal{T}(\mathcal{G})$ , where 445  $\alpha$  is the maximal number of kernels along a branch of  $\mathcal{T}(\mathcal{G})$ :  $\alpha$  is smaller than the depth of 446  $\mathcal{T}(\mathcal{G})$ , which is bounded by Proposition 9. 447

The subregion granularity considered before for kernel approximation crucially depends on the Lipschitz constant of output weights. The growth of these constants is bounded for kernels in  $\mathcal{T}(\mathcal{G})$  by Lemma 12. For non-kernel nodes of  $\mathcal{T}(\mathcal{G})$ , using a careful analysis of the algorithm of [1] (see details in Appendix D.2), we obtain the following bound:

<sup>452</sup> ► Lemma 13. If all the output weights of a WTG  $\mathcal{G}$  are K-Lipschitz-continuous over regions <sup>453</sup> (and piecewise linear, with finitely many pieces), then  $\operatorname{Val}_{\mathcal{G}}^{i}$  is KK'-Lipschitz-continuous over <sup>454</sup> regions, with K' polynomial in  $w_{\max}^{L}$  and |X| and exponential in i.

The overall time complexity of this method is doubly-exponential in the size of the input game and polynomial in  $1/\varepsilon$ . An example of execution of the approximation scheme can be found in Appendix D.3, and its complexity is analyzed in Appendix D.4.

<sup>&</sup>lt;sup>4</sup> Indeed, inf and sup are 1-Lipschitz-continuous functions, and with a fixed play  $\rho$ , the mapping wt<sub>T</sub>  $\rightarrow$  wt<sub>T</sub>( $\rho$ ) + wt<sub>T</sub>(last( $\rho$ )) is 1-Lipschitz-continuous.

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# 458 **6** Symbolic approximation algorithm

The previous approximation result suffers from several drawbacks: it relies on the SCC decomposition of the region automaton, which have to be analysed in a sequential way, and their analysis requires an a priori refinement of the granularity of regions. This approach is thus not easily amenable to implementation. We instead prove in this section that the symbolic approach based on the value iteration paradigm, i.e. the computation of iterates of the operator  $\mathcal{F}$  recalled in page 6, is an approximation scheme:

<sup>465</sup> ► **Theorem 14.** Let *G* be an almost-divergent WTG such that  $\operatorname{Val}_{\mathcal{G}} > -\infty$  for all configur-<sup>466</sup> ations. Then the sequence  $(\operatorname{Val}_{\mathcal{G}}^k)_{k \ge 0}$  converges towards  $\operatorname{Val}_{\mathcal{G}}$  and for every  $\varepsilon \in \mathbb{Q}_{>0}$ , we can <sup>467</sup> compute an integer *P* such that  $\operatorname{Val}_{\mathcal{G}}^P$  is an  $\varepsilon$ -approximation of  $\operatorname{Val}_{\mathcal{G}}$  for all configurations.

468 Sketch of proof. The proof relies on the semi-unfolding considered in the previous approx-469 imation scheme and on the following arguments:

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- $_{475}$  3. As the operator  $\mathcal{F}$  is 1-Lipschitz-continuous, imprecisions will sum up along the way.

The only new property is the first one, and it can be derived from the 1/N corner-point abstraction techniques developed in Section 5. Then, we can use all three properties to prove that a semi-unfolding can be approximated by an unfolding (without kernels) of the game that mirrors the computation of  $Val^P$ , and conclude.

This symbolic procedure avoids the three drawbacks (SCC decomposition, sequential 480 analysis of the SCCs, and refinement of the granularity of regions) of the previous approx-481 imation scheme. Moreover, it allows one to easily obtain an almost-optimal strategy w.r.t. 482 the computed value. Its proof relies on Section 5, and would not hold with the approxima-483 tion scheme of [10] (that does not maintain the continuity on regions of the computed value 484 functions, in turn needed to define output weights on 1/N-corners). If one has the guarantee 485 that no configurations of  $\mathcal{G}$  have value  $-\infty$ , then one can directly apply the value iteration 486 approach. If this is not the case, then one can perform the SCC decomposition of  $\mathcal{R}(\mathcal{G})$ , 487 and, as  $\mathcal{G}$  is almost-divergent, identify and remove regions whose value is  $-\infty$ , by Lemma 8. 488

# 489 **7** Conclusion

We have given an approximation procedure for a large class of weighted timed games with unbounded number of clocks and arbitrary integer weights that can be executed in doublyexponential time with respect to the size of the game. In addition, we proved the correction of a symbolic approximation scheme, that does not start by splitting exponentially every region, but only does so when necessary (as dictated by [1]). We argue that this paves the way towards an implementation of value approximation for weighted timed games.

Another perspective is to extend this work to the concurrent setting, where both players play simultaneously and the shortest delay is selected. We did not consider this setting in this work because concurrent WTGs are not determined, and several of our proofs rely on this property for symmetrical arguments (mainly to lift results of non-negative SCCs to non-positive ones). Another extension is the exploration of the effect of almost-divergence in the case of multiple weight dimensions, and/or with mean-payoff objectives.

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# 574 A Proofs of Section 2

**Proof of Lemma 2.** The set  $\{wt_{\Sigma}(\rho) \mid \rho \text{ finite play following } \pi\}$  is an interval as the image of a convex set by an linear function (see [6, Sec. 3.2] for an explanation). The good properties of the corner-point abstraction allows us to conclude, since for every play  $\rho$  following  $\pi$ , one can find a corner play following  $\pi$  of smaller weight and one of larger weight, and for every corner play  $\rho$  following  $\pi$  and every  $\varepsilon > 0$ , one can find a play following  $\pi$  whose weight is at most  $\varepsilon$  away from wt<sub> $\Sigma$ </sub>( $\rho$ ) [8].

# 581 A.1 Undecidability of value $-\infty$

We prove that given a WTG  $\mathcal{G}$  (not necessarily almost-divergent) and an initial location  $\ell_0$ , it is undecidable whether  $\operatorname{Val}_{\mathcal{G}}(\ell_0, \mathbf{0}) = -\infty$ . We reduce it to the existence problem on turnbased WTG: given a WTG  $\mathcal{G}$  (without output weight function), an integer threshold  $\alpha$  and a starting location  $\ell_0$ , does there exist a strategy for Min that can guarantee reaching the unique target location  $\ell_t$  from  $\ell_0$  with weight  $< \alpha$ . In the non-negative setting, it is proved in [7] that the problem is undecidable for the comparison  $\leq \alpha$ . In the negative setting, formal proofs are given for all comparison signs in [15].

<sup>589</sup> Consider  $\mathcal{G}'$  the WTG built from  $\mathcal{G}$  by adding a transition from  $\ell_t$  to  $\ell_0$ , without guards <sup>590</sup> and resetting all the clocks, of discrete weight  $-\alpha$ . We add a new target location  $\ell'_t$ , and <sup>591</sup> add transitions of weight 0 from  $\ell_t$  to  $\ell'_t$ . Location  $\ell_t$  is then given to Min. Let us prove that <sup>592</sup>  $\operatorname{Val}_{\mathcal{G}'}(\ell_0, \mathbf{0}) = -\infty$  if and only if Min has a strategy to guarantee a weight  $< \alpha$  in  $\mathcal{G}$ .

Assume first  $\operatorname{Val}_{\mathcal{G}'}(\ell_0, \mathbf{0}) = -\infty$ . If  $\operatorname{Val}_{\mathcal{G}}(\ell_0, \mathbf{0}) = -\infty$ , we are done. Otherwise, Min must follow in  $\mathcal{G}'$  the new transition from  $\ell_t$  to  $\ell_0$  to enforce a cycle of negative value, and thus enforce a play from  $(\ell_0, \mathbf{0})$  to  $\ell_t$  with weight less than  $\alpha$ . Therefore, there exists a strategy for Min in  $\mathcal{G}$  that can guarantee a weight  $< \alpha$ .

<sup>597</sup> Reciprocally, if there exists a strategy for Min that can guarantee a weight  $< \alpha$ , then <sup>598</sup> Min can force a negative cycle play and  $\operatorname{Val}_{\mathcal{G}'}(\ell_0, \mathbf{0}) = -\infty$ .

#### 599 A.2 Decision of the almost-divergence of a WTG

First, we state that a WTG  $\mathcal{G}$  is not almost-divergent if and only if  $\mathcal{R}(\mathcal{G})$  contains an SCC with either both a positive play following one of its cycles and a negative play following one of its cycles, or a play with weight in  $(-1,0) \cup (0,1)$  following one of its cycles. We will now explain how we can test both of those properties (and thus if a game is not almost-divergent) in PSPACE.

A corner play following a cycle of the region game is said to be simple if it does not visit the same corner twice (but the first and last corners can be the same). A simple corner play following a cycle has length bounded by  $|S| \times (|X| + 1)$ . By Lemma 2,  $\mathcal{R}(\mathcal{G})$  contains an SCC with either both a positive play following one of its cycles and a negative play following one of its cycles if and only if  $\mathcal{R}(\mathcal{G})$  contains both a positive corner play following one of its cycles and a negative corner play following one of its cycles. We will extend this to simple corner plays.

▶ Lemma 15.  $\mathcal{R}(\mathcal{G})$  contains an SCC with either both a positive play following one of its cycles and a negative play following one of its cycles if and only if  $\mathcal{R}(\mathcal{G})$  contains an SCC with both a positive simple corner play following one of its cycles and a negative simple corner play following one of its cycles.

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<sup>616</sup> **Proof.** All that is left to prove is that, in an SCC of  $\mathcal{R}(\mathcal{G})$ , if all simple corner plays following <sup>617</sup> a cycle have non-negative weight (resp. non-positive weight), then all corner plays following <sup>618</sup> a cycle have non-negative weight (resp. non-positive weight).

<sup>619</sup> By contradiction, we consider  $\rho$ , the shortest corner play following a cycle  $\pi$ , such that <sup>620</sup> wt<sub> $\Sigma$ </sub>( $\rho$ ) < 0 (resp. wt<sub> $\Sigma$ </sub>( $\rho$ ) > 0). Corner play  $\rho$  cannot be simple, so it must contain a simple <sup>621</sup> loop. That loop is a simple corner play following a cycle of  $\mathcal{R}(\mathcal{G})$ , so it must have non-<sup>622</sup> negative weight (resp. non-positive weight). This means that  $\rho$  without that loop satisfies <sup>623</sup> wt<sub> $\Sigma$ </sub>( $\rho$ ) < 0 (resp. wt<sub> $\Sigma$ </sub>( $\rho$ ) > 0), and therefore was not the shortest corner play with the <sup>624</sup> desired property.

We can test the existence of such simple corner plays in a SCC of  $\mathcal{R}(\mathcal{G})$  in NPSPACE, by guessing them corner after corner and by keeping the cumulated weight in memory. The check that both plays are in the same SCC is a reachability check in a timed automaton, which can be done in PSPACE. We described a similar procedure in [16] where we were testing the existence of a non-negative corner play and a non-positive one in the same SCC instead of a negative one and a positive one.

Now, we will assume in this second part that this test failed, so every SCC of  $\mathcal{R}(\mathcal{G})$  either satisfies that all plays following a cycle have non-negative weight or satisfies that they all have non-positive weight. We will now explain how to check if  $\mathcal{R}(\mathcal{G})$  contains a play with weight in  $(-1,0) \cup (0,1)$  following one of its cycles. Let  $B = (|S| \times (|X|+1))^2$ .

**Lemma 16.**  $\mathcal{R}(\mathcal{G})$  contains a play with weight in  $(-1, 0) \cup (0, 1)$  following one of its cycles if and only if  $\mathcal{R}(\mathcal{G})$  contains a cycle  $\pi$  of length at most B such that there is a corner play following  $\pi$  with weight zero and another one with non-zero weight.

<sup>638</sup> **Proof.** By Lemma 2,  $\mathcal{R}(\mathcal{G})$  contains a play with weight in  $(-1, 0) \cup (0, 1)$  following one of its <sup>639</sup> cycles if and only if that cycle satisfies that there is a corner play following it with weight <sup>640</sup> zero and another one with non-zero weight.

We only need to show that if there are no such cycles of length at most B, then there 641 are no such cycles of any length. Therefore, we assume that no cycle of length less than B642 allows a play with weight in  $(-1,0) \cup (0,1)$ . By contradiction, let  $\pi$  be the shortest cycle 643 such that there exist two corner plays  $\rho$  and  $\rho'$  following  $\pi$ , with  $\mathsf{wt}_{\Sigma}(\rho) = 0$  and  $\mathsf{wt}_{\Sigma}(\rho') \neq 0$ . 644 Then  $|\pi| > B$ . Let  $v_i$  be the *i*-th corner of  $\rho$ , and  $v'_i$  be the *i*-th corner of  $\rho'$ . There are at 645 most  $(|S| \times (|X|+1))^2$  different pairs  $(v_i, v'_i)$ , which implies that there must be two indexes, 646 j and k, such that  $(v_j, v'_j) = (v_k, v'_k)$  and j < k. The portion of  $\rho$  between indexes j and 647 k follows a cycle, and have opposite weight to the play constructed by considering  $\rho$  and 648 removing the loop between indexes j and k. Since the sum of their weight is 0 and they both 649 follow cycles of  $\mathcal{R}(\mathcal{G})$  in the same SCC, both of those plays have weight 0. The portion of  $\pi$ 650 between indexes j and k is a cycle shorter than  $\pi$ , and it contains a corner play of weight 0, 651 therefore all of its corner plays have weight 0, and the portion of  $\rho'$  between indexes j and 652 k has weight 0 too. But then the cycle defined by taking  $\pi$  and removing the loop between 653 indexes j and k contains a corner play of weight 0 (derived from  $\rho$ ), and a corner play of 654 weight non-zero (derived from  $\rho'$ ), and that contradicts  $\pi$  being the shortest cycle with that 655 property. 656

<sup>657</sup> Once again, we can check the existence of such a cycle of length bounded by *B* in <sup>658</sup> NPSPACE by guessing it and its two relevant corner plays on-the-fly and storing the cumu-<sup>659</sup> lated weight of each. This imply that deciding if a game  $\mathcal{G}$  is almost divergent is decidable in <sup>660</sup> coNPSPACE = NPSPACE = PSPACE (using the theorems of Immerman-Szelepcsényi [18, 22] <sup>661</sup> and Savitch [21]).

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Let us now show the PSPACE-hardness (indeed the coPSPACE, which is identical) by

a reduction from the reachability problem in a timed automaton. We consider a timed 663 automaton with a starting state and a different target state without outgoing transitions. 664 We construct from it a weighted timed game by distributing all states to Min, and equipping 665 all transitions with weight 0, and all states with weight 0. We also add a loop with weight 1 666 on the initial state, one with weight -1 on the target state, and a transition from the target 667 state to the initial state with weight 0, all three resetting all clocks and with no guard. Then, 668 the weighted timed game is not almost-divergent if and only if the target can be reached 669 from the initial state in the timed automaton. 670

# <sup>671</sup> **B** Proofs of the kernel characterisation (Section 3)

**Proof of Lemma 5.** If  $\pi$  is a 0-cycle, every such corner play  $\rho$  will have weight 0, by Lemma 2. Reciprocally, if such a corner play exists, all corner plays following  $\pi$  have weight 0, otherwise the set {wt<sub> $\Sigma$ </sub>( $\rho$ ) |  $\rho$  play following  $\pi$ } would have non-empty intersection with the set (-1, 1) \ {0} which would contradict the almost-divergence.

**Proof of Lemma 6.** First, notice that since  $\pi_1 = \pi \pi'$  is a cycle,  $first(\pi) = last(\pi')$  and 676  $\operatorname{first}(\pi') = \operatorname{last}(\pi)$ , so  $\pi_2 = \pi'\pi$  is correctly defined. Then, let us define two sequences of 677 region corners  $(v_i \in \text{first}(\pi))_i$  and  $(v'_i \in \text{first}(\pi'))_i$ . We start by choosing any  $v_0 \in \text{first}(\pi)$ . 678 Let  $v'_0$  be a corner of first $(\pi')$  such that  $v'_0$  is accessible from  $v_0$  by following  $\pi$ . For every i > 0, 679 let  $v_i$  be a corner of first $(\pi)$  such that  $v_i$  is accessible from  $v'_{i-1}$  by following  $\pi'$ , and let  $v'_i$  be a 680 corner of  $\operatorname{first}(\pi')$  such that  $v'_i$  is accessible from  $v_i$  by following  $\pi$ . We stop the construction 681 at the first l such that there exists k < l with  $v_k = v_l$ . Additionally, we let  $v'_l = v'_k$ 682 and  $v_{l+1} = v_{k+1}$ . This process is bounded since first( $\pi$ ) has at most |X| + 1 corners. 683

For every  $0 \leq i \leq l$ , let  $w_i$  be the weight of a play  $\rho_i$  from  $v_i$  to  $v'_i$  along  $\pi$ , and let  $w'_i$ be the weight of a play  $\rho'_i$  from  $v'_i$  to  $v_{i+1}$  along  $\pi'$ . The concatenation of the two plays has weight  $w_i + w'_i = 0$ , since it follows the 0-cycle  $\pi_1$ . Therefore, all corner plays from  $v_i$  to  $v'_i$ following  $\pi$  have the same weight  $w_i$ , and the same applies for  $w'_i$ . For every  $0 \leq i < l$ , the concatenation of  $\rho'_i$  and  $\rho_{i+1}$  is a play from  $v'_i$  to  $v_{i+1}$ , of weight  $w'_i + w_{i+1} = -w_i + w_{i+1}$ , following  $\pi_2$ . Since  $\pi_2$  is a cycle, and the game is almost-divergent, all possible values of  $w_{i+1} - w_i$  have the same sign.

Finally, we can construct a corner play from  $v'_k$  to  $v'_l$  by concatenating the plays  $\rho'_k, \rho_{k+1}$ ,  $\rho'_{k+1}, \rho_{k+2}, \ldots, \rho'_{l-1}, \rho_l$ . That play has weight  $\sum_{i=k}^{l-1} (w_{i+1} - w_i) = w_l - w_k = 0$ . This implies that the terms  $w_{i+1} - w_i$ , of constant sign, are all equal to 0. As a consequence, the concatenation of  $\rho'_k$  and  $\rho_{k+1}$  is a corner play following  $\pi_2$  of weight 0. By Lemma 5, we deduce that  $\pi_2$  is a 0-cycle.

# **Lemma 17.** If $t_1 \cdots t_n$ is a path in K, then $t_1 t_2 \cdots t_n \pi_{t_n} \cdots \pi_{t_2} \pi_{t_1}$ is a 0-cycle of $\mathcal{R}(\mathcal{G})$ .

<sup>697</sup> **Proof.** We prove the property by induction on n. For n = 1, the property is immediate <sup>698</sup> since  $t_1\pi_{t_1}$  is a 0-cycle. Consider then n such that the property holds for n, and prove it for <sup>699</sup> n + 1. We will exhibit two corner plays following  $t_1 \cdots t_{n+1}\pi_{t_{n+1}} \cdots \pi_{t_1}$  of opposite weight <sup>700</sup> and conclude with Lemma 5.

Let  $v_0$  be a corner of  $\mathsf{last}(t_{n+1})$ . Since  $t_{n+1}\pi_{t_{n+1}}$  is a 0-cycle, there exists  $w \in \mathbb{Z}$ , a corner play  $\rho_0$  following  $t_{n+1}$  ending in  $v_0$  with weight w and a corner play  $\rho'_0$  following  $\pi_{t_{n+1}}$ beginning in  $v_0$  with weight -w. We name  $v'_0$  the corner of  $\mathsf{last}(t_n)$  where ends  $\rho'_0$ . We consider any corner play  $\rho_1$  following  $t_{n+1}$  from corner  $v'_0$ . The corner play  $\rho'_0\rho_1$  follows the path  $\pi_{t_{n+1}}t_{n+1}$  that is also a 0-cycle by Lemma 6, therefore  $\rho_1$  has weight w. We denote by  $v_1$  the corner where ends  $\rho_1$ . By iterating this construction, we obtain some corner plays

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<sup>707</sup>  $\rho_0, \rho_1, \rho_2, \ldots$  following  $t_{n+1}$  and  $\rho'_0, \rho'_1, \rho'_2, \ldots$  following  $\pi_{t_{n+1}}$  such that  $\rho'_i$  goes from corner <sup>708</sup>  $v_i$  to  $v'_i$ , and  $\rho_{i+1}$  from corner  $v'_i$  to  $v_{i+1}$ , for all  $i \ge 0$ . Moreover, all corner plays  $\rho_i$  have <sup>709</sup> weight w and all corner plays  $\rho'_i$  have weight -w. Consider the first index l such that  $v_l = v_k$ <sup>710</sup> for some k < l, which exists because the number of corners is finite.

We apply the induction to find a corner play following  $t_1 \cdots t_n \pi_{t_n} \cdots \pi_{t_1}$ , going through the corner  $v'_k$  in the middle: more formally, there exists  $w_{\alpha}$ , a corner play  $\rho_{\alpha}$  following  $t_1 \cdots t_n$  ending in  $v'_k$  with weight  $w_{\alpha}$  and a corner play  $\rho'_{\alpha}$  following  $\pi_{t_n} \cdots \pi_{t_1}$  beginning in  $v'_k$  with weight  $-w_{\alpha}$ . We apply the induction a second time with corner  $v'_{l-1}$ : there exists  $w_{\beta}$ , a corner play  $\rho_{\beta}$  following  $t_1 \cdots t_n$  ending in  $v'_{l-1}$  with weight  $w_{\beta}$  and a corner play  $\rho'_{\beta}$ following  $\pi_{t_n} \cdots \pi_{t_1}$  beginning in  $v'_{l-1}$  with weight  $-w_{\beta}$ .

The corner play  $\rho_{\alpha}\rho_{k+1}\rho'_{k+1}\rho_{k+2}\rho'_{k+2}\cdots\rho'_{l-1}\rho'_{\beta}$ , of weight  $w_{\alpha} + (w-w)^{l-k} - w_{\beta} = w_{\alpha} - w_{\beta}$ , follows the cycle  $t_1\cdots t_n(t_{n+1}\pi_{t_{n+1}})^{l-k}\pi_{t_n}\cdots\pi_{t_1}$ . The corner play  $\rho_{\beta}\rho_l\rho'_k\rho'_{\alpha}$ , of weight  $w_{\beta} + w - w - w_{\alpha} = w_{\beta} - w_{\alpha}$ , follows the cycle  $t_1\cdots t_n t_{n+1}\pi_{t_{n+1}}\pi_{t_n}\cdots\pi_{t_1}$ . Since the game is almost-divergent, and those two corner plays are in the same SCC, both have weight 0. The second corner play of weight 0 ensures that the cycle  $t_1\cdots t_{n+1}\pi_{t_{n+1}}\cdots\pi_{t_1}$ is a 0-cycle, by Lemma 5.

# <sup>723</sup> C Proofs of the semi-unfolding (Section 4)

**Proof of Lemma 8.** We detail the case of non-negative SCCs. Let us prove that a configurations has value  $-\infty$  if and only if it belongs to a state where player Min can ensure the LTL formula on transitions:  $\phi = (G(\neg T_f^{\mathbb{R}}) \land \neg FGT_{\mathsf{K}}) \lor FT_f^{-\infty}$ . Since  $\omega$ -regular games are determined, this is equivalent to saying that a configuration has finite value if and only if it belongs to a state where Max can ensure  $\neg \phi$ .

If s is a state where Min can ensure  $\phi$ , he can ensure  $-\infty$  value from all configurations in s by either reaching  $S_f^{-\infty}$  or avoiding  $S_f^{\mathbb{R}}$  for as long as he desires, while not getting stuck in K, and thus going through an infinite number of negative cycles by Proposition 7. This proves that a state where Max cannot ensure  $\neg \phi$  contains only valuations of value  $-\infty$ . Conversely, if s is a state where Max can ensure  $\neg \phi = (\mathrm{F}T_f^{\mathbb{R}} \vee \mathrm{F}\mathrm{G}T_{\mathsf{K}}) \wedge \mathrm{G} \neg T_f^{-\infty}$ , then from s, Max must be able to avoid  $S_f^{-\infty}$ , and eventually enforce either  $S_f^{\mathbb{R}}$  reachability or staying in K forever. In both cases, Max can ensure a value above  $-\infty$ .

## 736 C.1 Semi-unfolding construction

<sup>737</sup> In order to prove Proposition 9, we will construct the desired semi-unfolding  $\mathcal{T}(\mathcal{G})$  of a <sup>738</sup> (non-negative or non-positive SCC)  $\mathcal{G}$ .

<sup>739</sup> If  $(\ell, r)$  is in K, we let  $\mathsf{K}_{\ell,r}$  be the part of K accessible from  $(\ell, r)$  (note that  $\mathsf{K}_{\ell,r}$  is an <sup>740</sup> SCC as K is a disjoint set of SCCs). We define the output transitions of  $\mathsf{K}_{\ell,r}$  as being the <sup>741</sup> output transitions of K accessible from  $(\ell, r)$ . If  $(\ell, r)$  is not in K, the output transitions <sup>742</sup> of  $(\ell, r)$  are the transitions of  $\mathcal{R}(\mathcal{G})$  starting in  $(\ell, r)$ .

Formally, we define a tree T whose nodes will either be labelled by region graph states 743  $(\ell, r) \in S \setminus S_{\mathsf{K}}$  or by kernels  $\mathsf{K}_{\ell, r}$ , and whose edges will be labelled by output transitions 744 in  $\mathcal{R}(\mathcal{G})$ . The root of the tree T is labelled with  $(\ell_0, r_0)$ , or  $\mathsf{K}_{\ell_0, r_0}$  (if  $(\ell_0, r_0)$  belongs to 745 the kernel), and the successors of a node of T are then recursively defined by its output 746 transitions. When a state  $(\ell, r)$  is reached by an output transition, the child is labelled 747 by  $\mathsf{K}_{\ell,r}$  if  $(\ell,r) \in \mathsf{K}$ , otherwise it is labelled by  $(\ell,r)$ . Edges in T are labelled by the 748 transitions used to create them. Along every branch, we stop the construction when either 749 a final state is reached (i.e. a state not inside the current SCC) or the branch contains 750  $3|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup|wt_T| + 2$  nodes labelled by the same state  $((\ell, r) \text{ or } \mathsf{K}_{\ell, r})$ . Since  $\mathcal{R}(\mathcal{G})$ 751

has a finite number of states, T is finite. Leaves of T with a location belonging to  $L_T$  are called *target leaves*, others are called *stopped leaves*.

We now transform T into a WTG  $\mathcal{T}(\mathcal{G})$ , by replacing every node labelled by a state  $(\ell, r)$ 754 by a different copy  $(\ell, r)$  of  $(\ell, r)$ . Those states are said to inherit from  $(\ell, r)$ . Edges of T 755 are replaced by the transitions labelling them, and have a similar notion of inheritance. 756 Every non-leaf node labelled by a kernel  $\mathsf{K}_{\ell,r}$  is replaced by a copy of the WTG  $\mathsf{K}_{\ell,r}$ , output 757 transitions being plugged in the expected way. We deal with stopped leaves labelled by 758 a kernel  $K_{\ell,r}$  by replacing them with a single node copy of  $(\ell, r)$ , like we dealt with node 759 labelled by a state  $(\ell, r)$ . State partition between players and weights are inherited from the 760 copied states of  $\mathcal{R}(\mathcal{G})$ . The only initial state of  $\mathcal{T}(\mathcal{G})$  is the state denoted by  $(\ell_0, r_0)$  inherited 761 from  $(\ell_0, r_0)$  in the root of T (either  $(\ell_0, r_0)$  or  $\mathsf{K}_{\ell_0, r_0}$ ). The final states of  $\mathcal{T}(\mathcal{G})$  are the states 762 derived from leaves of T. If  $\mathcal{R}(\mathcal{G})$  is a non-negative (resp. non-positive) SCC, the output 763 weight function  $\mathsf{wt}_T$  is inherited from  $\mathcal{R}(\mathcal{G})$  on target leaves and set to  $+\infty$  (resp.  $-\infty$ ) on 764 stopped leaves. 765

### 766 C.2 Semi-unfolding correction

<sup>767</sup> We will now prove that Proposition 9 holds on this  $\mathcal{T}(\mathcal{G})$ .

**Lemma 18.** All finite plays in  $\mathcal{R}(\mathcal{G})$  have cumulated weight (ignoring output weights) at least  $-|\mathcal{R}(\mathcal{G})|w_{\max}^e$  in the non-negative case, and at most  $|\mathcal{R}(\mathcal{G})|w_{\max}^e$  in the non-positive case. Moreover, values of the game are bounded by  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |wt_T|$ .

**Proof.** Suppose first that  $\mathcal{R}(\mathcal{G})$  is a non-negative SCC. Consider a play  $\rho$  following a path  $\pi$ .  $\pi$  can be decomposed into  $\pi = \pi_1 \pi_1^c \cdots \pi_n \pi_n^c$  such that every  $\pi_i^c$  is a cycle, and  $\pi_1 \ldots \pi_n$ is a simple path in  $\mathcal{R}(\mathcal{G})$  (thus  $\sum_{i=1}^n |\pi_i| \leq |\mathcal{R}(\mathcal{G})|$ ). Let us define all plays  $\rho_i$  and  $\rho_i^c$  as the restrictions of  $\rho$  on  $\pi_i$  and  $\pi_i^c$ . Now, since all plays following cycles have cumulated weight at least 0,  $\mathsf{wt}_{\Sigma}(\rho) = \sum_{i=1}^n \mathsf{wt}_{\Sigma}(\rho_i) + \mathsf{wt}_{\Sigma}(\rho_i^c) \geq \sum_{i=1}^n -w_{\max}^e |\rho_i| + 0 \geq -|\mathcal{R}(\mathcal{G})| w_{\max}^e$ . Similarly, we can show that every play in a non-positive SCC has cumulated weight at most  $\pi_i = |\mathcal{R}(\mathcal{G})| w_{\max}^e$ .

For the bound on the values, consider again two cases. If  $\mathcal{R}(\mathcal{G})$  is non-negative, consider 778 any memoryless attractor strategy  $\sigma_{Min}$  for Min toward  $S_f$ . Since all states have values 779 below  $+\infty$ , all plays obtained from strategies of Max will follow simple paths of  $\mathcal{R}(\mathcal{G})$ , that 780 have cumulated weight at most  $|\mathcal{R}(\mathcal{G})|w_{\max}^e$  in absolute value. Similarly, if  $\mathcal{R}(\mathcal{G})$  is non-781 positive, following the proof of Lemma 8, since all values are above  $-\infty$ , Max can ensure 782  $\neg \phi \Rightarrow FT_f^{\mathbb{R}} \lor FGT_{\mathsf{K}}$  on all states. Then we can construct a strategy  $\sigma_{\mathsf{Max}}$  for  $\mathsf{Max}$  combining an 783 attractor strategy toward  $S_f$  on states satisfying  $\mathrm{FT}_f^{\mathbb{R}}$ , a safety strategy on states satisfying 784  $GT_{\rm K}$ , and an attractor strategy toward the latter on all other states. Then, all plays obtained 785 from strategies of Min will either not be winning  $(GT_{\mathsf{K}})$  or follow simple paths of  $\mathcal{R}(\mathcal{G})$ . Both 786 cases imply that the values of the game are bounded by  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |wt_T|$ . 787

▶ Lemma 19. All plays in  $\mathcal{T}(\mathcal{G})$  from the initial state to a stopped leaf have cumulated weight at least  $2|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup |wt_T| + 1$  if the SCC  $\mathcal{R}(\mathcal{G})$  is non-negative, and at most  $-2|\mathcal{R}(\mathcal{G})|w_{\max}^e - 2\sup |wt_T| - 1$  if it is non-positive.

**Proof.** Note that by construction, all finite paths in  $\mathcal{T}(\mathcal{G})$  from the initial state to a stopped leaf can be decomposed as  $\pi' \pi_1 \cdots \pi_{3|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup|wt_T|+1}$  with all  $\pi_i$  being cycles. Additionally, those cycles cannot be 0-cycles by Proposition 7, since they take at least one transition outside of K. Therefore the restriction of  $\rho$  to  $\pi_1 \cdots \pi_{3|\mathcal{R}(\mathcal{G})|w_{\max}^e + 1}$  has weight at least  $3|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup|wt_T| + 1$  (in the non-negative case) and at most  $-3|\mathcal{R}(\mathcal{G})|w_{\max}^e -$ 

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<sup>796</sup> 2 sup  $|wt_T| - 1$  (in the non-positive case). The beginning of the play, following  $\pi'$ , has cu-<sup>797</sup> mulated weight at least  $-|\mathcal{R}(\mathcal{G})|w_{\max}^e$  (in the non-negative case) and at most  $|\mathcal{R}(\mathcal{G})|w_{\max}^e$ <sup>798</sup> (in the non-positive case), by Lemma 18.

Two plays  $\rho = ((\ell_1, r_1), \nu_1) \xrightarrow{d_1, t_1} \cdots \xrightarrow{d_{n-1}, t_{n-1}} ((\ell_n, r_n), \nu_n)$  and  $\tilde{\rho} = ((\tilde{\ell}_1, r_1), \nu_1) \xrightarrow{d_1, \tilde{\ell}_1} \cdots \xrightarrow{d_{n-1}, \tilde{\ell}_{n-1}} ((\tilde{\ell}_n, r_n), \nu_n)$  in  $\mathcal{R}(\mathcal{G})$  and  $\mathcal{T}(\mathcal{G})$ , respectively, are said to *mimic* each other if every  $(\tilde{\ell}_i, r_i)$  is inherited from  $(\ell_i, r_i)$  and every transition  $\tilde{t}_i$  is inherited from the transition  $\delta_i$ . Combining Lemmas 19 and 18, we obtain

▶ Lemma 20. If  $\mathcal{R}(\mathcal{G})$  is a non-negative (resp. non-positive) SCC, every play from the initial state and with cumulated weight less than  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup|wt_T| + 1$  (resp. greater than  $-|\mathcal{R}(\mathcal{G})|w_{\max}^e - 2\sup|wt_T| - 1$ ) can be mimicked in  $\mathcal{T}(\mathcal{G})$  without reaching a stopped leaf. Conversely, every play in  $\mathcal{T}(\mathcal{G})$  reaching a target leaf can be mimicked in  $\mathcal{R}(\mathcal{G})$ .

**Proof.** We prove only the non-negative case. Let  $\rho$  be a play of  $\mathcal{R}(\mathcal{G})$  with cumulated weight less than  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2 \sup |wt_T| + 1$ . Consider the branch of the unfolded game it follows. If  $\rho$  cannot be mimicked in  $\mathcal{T}(\mathcal{G})$ , then a prefix of  $\rho$  reaches the stopped leaf of that branch when mimicked in  $\mathcal{T}(\mathcal{G})$ . In this situation,  $\rho$  starts by a prefix of weight at least  $2|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2 \sup |wt_T| + 1$  by Lemma 19 and then ends with a suffix play of weight at least  $-|\mathcal{R}(\mathcal{G})|w_{\max}^e$  by Lemma 18, and that contradicts the initial assumption. The nonpositive case is proved exactly the same way, and the converse is true by construction.

Then, the plays of  $\mathcal{R}(\mathcal{G})$  starting in an initial configuration that cannot be mimicked in  $\mathcal{T}(\mathcal{G})$  are not useful for value computation, which is formalised by Proposition 21:

▶ Proposition 21. For all valuations  $\nu_0 \in r_0$ ,  $\operatorname{Val}_{\mathcal{G}}(\ell_0, \nu_0) = \operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$ .

Proof. By Lemma 1, we already know that  $\operatorname{Val}_{\mathcal{G}}(\ell_0, \nu_0) = \operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0)$ . Recall that we only left finite values in  $\mathcal{R}(\mathcal{G})$  (in the final weight functions, in particular), and more precisely  $|\operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0)| \leq |\mathcal{R}(\mathcal{G})| w_{\max}^e + \sup |\operatorname{wt}_T|$  by Lemma 18. We first show that the value is also finite in  $\mathcal{T}(\mathcal{G})$ . Indeed, if  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0, r_0), \nu_0) = +\infty$ , since we assumed all output weights of  $\mathcal{R}(\mathcal{G})$  bounded, we are necessarily in the non-negative case, and Max is able to ensure stopped leaves reachability.

<sup>823</sup> Claim 1.If  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0, r_0), \nu_0) = +\infty$ , then there are no winning strategies in  $\mathcal{R}(\mathcal{G})$  for Min <sup>824</sup> ensuring weight less than  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |\mathsf{wt}_T| + 1$  from  $(\ell_0, r_0)$ .

Thus, we can obtain the contradiction  $\operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) > |\mathcal{R}(\mathcal{G})| w_{\max}^e + \sup |\operatorname{wt}_T|.$ 

Proof of Claim 1. By contradiction, consider a strategy  $\sigma_{\text{Min}}$  of Min ensuring weight  $A \leq |\mathcal{R}(\mathcal{G})| w_{\text{max}}^e + \sup |\mathsf{wt}_T| + 1$  in  $\mathcal{R}(\mathcal{G})$ . Then, for all  $\sigma_{\text{Max}}$ , the cumulated weight of  $\mathsf{play}_{\mathcal{R}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0), \sigma_{\text{Min}}, \sigma_{\text{Max}})$  (reaching target configuration  $(\ell, \nu)$ ) is at most  $A - \mathsf{wt}_T(\ell, \nu) \leq |\mathcal{R}(\mathcal{G})| w_{\text{max}}^e + 2 \sup |\mathsf{wt}_T| + 1$ , and by Lemma 20 this play does not reach a stopped leaf when mimicked in  $\mathcal{T}(\mathcal{G})$ , which is absurd.

If  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) = -\infty$ , we are necessarily in the non-positive case, and by construction this implies having Min ensuring stopped leaves reachability in  $\mathcal{T}(\mathcal{G})$ .

<sup>833</sup> Claim 2.If  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) = -\infty$ , then there are no winning strategies in  $\mathcal{R}(\mathcal{G})$  for Max <sup>834</sup> ensuring weight above  $-|\mathcal{R}(\mathcal{G})|w_{\max}^e - \sup |\mathsf{wt}_T| - 1$  from  $(\ell_0, r_0)$ .

Thus, we can obtain the contradiction  $\mathsf{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) < -|\mathcal{R}(\mathcal{G})|w_{\max}^e - \sup |\mathsf{wt}_T|.$ 

Proof of Claim 2. By contradiction, consider a strategy  $\sigma_{Max}$  of Max ensuring weight  $A \ge -|\mathcal{R}(\mathcal{G})|w_{\max}^e - \sup |wt_T| - 1$  in  $\mathcal{R}(\mathcal{G})$ . Then, for all  $\sigma_{Min}$ , the cumulated weight of  $\mathsf{play}_{\mathcal{R}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0), \sigma_{Min}, \sigma_{Max})$  (reaching target configuration  $(\ell, \nu)$ ) is at least  $A - \mathsf{wt}_T(\ell, \nu) \ge -|\mathcal{R}(\mathcal{G})|w_{\max}^e - 2\sup |wt_T| - 1$ , and by Lemma 20 this play does not reach a stopped leaf when mimicked in  $\mathcal{T}(\mathcal{G})$ , which is absurd.

Then, strategies and plays of  $\mathcal{T}(\mathcal{G})$  starting from  $(\tilde{\ell}_0, r_0)$  can be mimicked in  $\mathcal{R}(\mathcal{G})$ , therefore  $\mathsf{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\tilde{s}_0, \nu_0)$ : If  $\mathcal{R}(\mathcal{G})$  is non-negative, for all  $\varepsilon > 0$  we can fix an  $\varepsilon$ -optimal strategy  $\sigma_{\mathsf{Min}}$  for Min in  $\mathcal{T}(\mathcal{G})$ . It is a winning strategy, so every play derived from  $\sigma_{\mathsf{Min}}$  in  $\mathcal{T}(\mathcal{G})$  reaches a target leaf, and can be mimicked in  $\mathcal{R}(\mathcal{G})$  by Lemma 20. Therefore,  $\sigma_{\mathsf{Min}}$  can be mimicked in  $\mathcal{R}(\mathcal{G})$ , where it is also winning, with the same weight. From this we deduce  $\mathsf{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\tilde{s}_0, \nu_0)$ . If  $\mathcal{R}(\mathcal{G})$  is non-positive, the same reasoning applies by considering an  $\varepsilon$ -optimal strategy for Max in  $\mathcal{T}(\mathcal{G})$ .

Let us now show that  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0)$ . If  $\mathcal{R}(\mathcal{G})$  is non-negative, 848 let us fix  $0 < \varepsilon < 1$ , an  $\varepsilon$ -optimal strategy  $\sigma_{\mathsf{Min}}$  for Min in  $\mathcal{R}(\mathcal{G})$ , and a strategy  $\sigma_{\mathsf{Max}}$  of Max 849 in  $\mathcal{R}(\mathcal{G})$ . Let  $\rho$  be their outcome  $\mathsf{play}_{\mathcal{R}(\mathcal{G})}(((\ell_0, r_0), \nu_0), \sigma_{\mathsf{Min}}, \sigma_{\mathsf{Max}})), \rho_k$  be the finite prefix of 850  $\rho$  defining its cumulative weight and  $(\ell_k, \nu_k)$  be the configuration defining its output weight, 851 such that  $\operatorname{wt}_{\mathcal{R}(\mathcal{G})}(\rho) = \operatorname{wt}_{\Sigma}(\rho_k) + \operatorname{wt}_T(\ell_k, \nu_k)$ . Then,  $\operatorname{wt}_{\mathcal{R}(\mathcal{G})}(\rho) \leq \operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) + \varepsilon < \varepsilon$ 852  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |\mathsf{wt}_T| + 1$ , therefore  $\mathsf{wt}_{\Sigma}(\rho_k) < |\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |\mathsf{wt}_T| + 1 - \mathsf{wt}_T(\ell_k, \nu_k) \leq 1$ 853  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup |wt_T| + 1$  and by Lemma 20 all such plays  $\rho$  can be mimicked in  $\mathcal{T}(\mathcal{G})$ , 854 and  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \operatorname{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0)$ . Once again, if  $\mathcal{R}(\mathcal{G})$  is non-positive, the 855 same reasoning applies by considering an  $\varepsilon$ -optimal strategy for Max in  $\mathcal{R}(\mathcal{G})$ . 856

This proof not only holds on an SCC, but also on full almost-divergent WTGs, by simply stacking the semi-unfoldings of each SCC on top of each others.

Note that the semi-unfolding procedure of an SCC depends on  $\sup |wt_T|$ , where  $wt_T$ can be the value function of an SCCs under the current one. Assuming all configurations have finite value, we can extend the reasoning of Lemma 18 and bound all values in the full game by  $|\mathcal{R}(\mathcal{G})|w_{\max}^e + \sup |wt_T|$ , which let us bound uniformly the unfolding depth of each SCC and gives us a bound on the depth of the complete semi-unfolding tree:  $|\mathcal{R}(\mathcal{G})|(5|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup |wt_T| + 2) + 1$ 

# **D** Proofs of the approximation scheme (Section 5)

# <sup>866</sup> D.1 Proofs of the approximation of kernels

**Proof of Lemma 10.** Since  $\rho$  and  $\rho'$  follow the same locations  $\ell$  of  $\mathcal{G}$ , one reaches a target location if and only if the other does. In the case where they do not reach a target location, both weights are infinite, and thus equal. We now look at the case where both plays reach a target location, moreover in the same step.

<sup>871</sup> Consider the region path  $\pi$  of the run  $\rho$ :  $\pi$  can be decomposed into a simple path with <sup>872</sup> maximal cycles in it. The number of such maximal cycles is bounded by  $|L \times \text{Reg}(X, M)|$ <sup>873</sup> and the remaining simple path has length at most  $|L \times \text{Reg}(X, M)|$ . Since all cycles of a <sup>874</sup> kernel are 0-cycles, the parts of  $\rho$  that follow the maximal cycles have weight exactly 0.

<sup>875</sup> Consider the same decomposition for the play  $\rho'$ . Cycles of  $\pi$  do not necessarily map to <sup>876</sup> cycles over locations of  $C_N(\mathcal{G})$ , since the 1/N-regions could be distinct. However, Lemma 2 <sup>877</sup> shows that, for all those cycles of  $\pi$ , there exists a sequence of finite plays of  $\mathcal{G}$  whose weight <sup>878</sup> tends to the weight of  $\rho'$ . Since all those finite plays follow a cycle of the region game <sup>879</sup>  $\mathcal{R}(\mathcal{G})$  (with  $\mathcal{G}$  being a kernel), they all have weight 0. Hence, the parts of  $\rho'$  that follow the <sup>880</sup> maximal cycles of  $\pi$  have also weight exactly 0.

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Therefore, the difference  $|\mathsf{wt}_{\mathcal{G}}(\rho) - \mathsf{wt}_{\mathcal{C}_N(\mathcal{G})}(\rho')|$  is concentrated on the remaining simple path of  $\pi$ : on each transition of this path, the maximal weight difference is  $1/N \times w_{\max}^L$ since 1/N is the largest difference possible in time delays between plays that stay 1/N-close (since they stay in the same 1/N-regions). Moreover, the difference between the output weight functions is bounded by K/N, since the output weight function  $\mathsf{wt}_T$  is K-Lipschitzcontinuous and the output weight function of  $\mathcal{C}_N(\mathcal{G})$  is obtained as limit of  $\mathsf{wt}_T$ . Summing the two contributions, we obtain as upper bound the constant  $\mathbf{B}/N$ .

Proof of Lemma 11. Let us prove that both  $\operatorname{Val}_{\mathcal{G}}(\ell,\nu) \leq \operatorname{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell,r,v),v) + \alpha$  and Val<sub> $\mathcal{C}_N(\mathcal{G})$ </sub> $((\ell,r,v),v) \leq \operatorname{Val}_{\mathcal{G}}(\ell,\nu) + \alpha$ , with  $\alpha = \mathbf{B}/N$ . By definition and determinacy of turn based WTG, this is equivalent to proving these two inequalities:

<sup>891</sup> 
$$\inf_{\sigma_{\mathsf{Min}}} \sup_{\sigma_{\mathsf{Max}}} \mathsf{wt}_{\mathcal{G}}(\mathsf{play}((\ell,\nu),\sigma_{\mathsf{Max}},\sigma_{\mathsf{Min}})) \leqslant \inf_{\sigma'_{\mathsf{Min}}} \sup_{\sigma'_{\mathsf{Max}}} \mathsf{wt}_{\mathcal{C}_{N}(\mathcal{G})}(\mathsf{play}(((\ell,r,v),v),\sigma'_{\mathsf{Max}},\sigma'_{\mathsf{Min}})) + \alpha$$

892 893

$$\sup_{\sigma'_{\mathsf{Max}}} \inf_{\sigma'_{\mathsf{Min}}} \mathsf{wt}_{\mathcal{C}_N(\mathcal{G})}(\mathsf{play}(((\ell, r, v), v), \sigma'_{\mathsf{Max}}, \sigma'_{\mathsf{Min}})) \leqslant \sup_{\sigma_{\mathsf{Max}}} \inf_{\sigma_{\mathsf{Min}}} \mathsf{wt}_{\mathcal{G}}(\mathsf{play}((\ell, \nu), \sigma_{\mathsf{Max}}, \sigma_{\mathsf{Min}})) + \alpha$$

Let  $(\beta)$  denote  $|wt_{\mathcal{G}}(play((\ell, \nu), \sigma_{Max}, \sigma_{Min})) - wt_{\mathcal{C}_{N}(\mathcal{G})}(play(((\ell, r, v), v), \sigma'_{Max}, \sigma'_{Min}))| \leq \alpha$ . To show the first inequality, it suffices to show that for all  $\sigma'_{Min}$ , there exists  $\sigma_{Min}$  such that for all  $\sigma_{Max}$ , there is  $\sigma'_{Max}$  verifying  $(\beta)$ . For the second, it suffices to show that for all  $\sigma'_{Max}$ , there exists  $\sigma_{Max}$  such that for all  $\sigma_{Min}$ , there is  $\sigma'_{Min}$  verifying  $(\beta)$ . We will detail the proof for the first, the second being syntactically the same, with both players swapped.

Equation ( $\beta$ ) can be obtained from Lemma 10, under the condition that the plays play(( $\ell, \nu$ ),  $\sigma_{Max}, \sigma_{Min}$ ) and play((( $\ell, r, v$ ), v),  $\sigma'_{Max}, \sigma'_{Min}$ ) are 1/N-close. Therefore, we fix a strategy  $\sigma'_{Min}$  of Min in the game  $C_N(\mathcal{G})$ , and we construct a strategy  $\sigma_{Min}$  of Min in  $\mathcal{G}$ , as well as two mappings  $f: \mathsf{FPlays}^{\mathsf{Min}}_{\mathcal{G}} \to \mathsf{FPlays}^{\mathsf{Min}}_{\mathcal{C}_N(\mathcal{G})} \to \mathsf{FPlays}^{\mathsf{Max}}_{\mathcal{G}}$  such that:

for all  $\rho \in \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Min}}$ ,  $\rho$  and  $f(\rho)$  are 1/N-close, and if  $\rho$  is consistent with  $\sigma_{\mathsf{Min}}$  and starts in  $(\ell, \nu)$ , then  $f(\rho)$  is consistent with  $\sigma'_{\mathsf{Min}}$  and starts in  $((\ell, r, v), v)$ ;

<sup>905</sup> = for all  $\rho' \in \mathsf{FPlays}_{\mathcal{C}_N(\mathcal{G})}^{\mathsf{Max}}$ ,  $g(\rho')$  and  $\rho'$  are 1/N-close, and if  $\rho'$  is consistent with  $\sigma'_{\mathsf{Min}}$  and <sup>906</sup> starts in  $((\ell, r, v), v)$ , then  $g(\rho')$  is consistent with  $\sigma_{\mathsf{Min}}$  and starts in  $(\ell, \nu)$ .

We build  $\sigma_{\text{Min}}$ , f, and g by induction on the length n of plays, over prefixes of plays of length n-1, n and n, respectively. For n = 0 (plays of length 0 are those restricted to a single configuration), we let  $f(\ell, \nu) = ((\ell, r, v), v)$  and  $g((\ell, r, v), v) = (\ell, \nu)$ , leaving the other values arbitrary (since we will not use them).

Then, we suppose  $\sigma_{Min}$ , f, and g built until length n-1, n and n, respectively (if 911  $n = 0, \sigma_{Min}$  has not been build yet), and we define them on plays of length n, n + 1 and 912 n+1, respectively. For every  $\rho \in \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Min}}$  of length n, we note  $\rho' = f(\rho)$ . Consider 913 the decision  $(d', \delta') = \sigma'_{\mathsf{Min}}(\rho')$  and  $\rho'_{+}$  the prefix  $\rho'$  extended with the decision  $(d', \delta')$ . By 914 timed bisimulation, there exists  $(d, \delta)$  such that the prefix  $\rho_+$  composed of  $\rho$  extended with 915 the decision  $(d, \delta)$  builds 1/N-close plays  $\rho_+$  and  $\rho'_+$ . We let  $\sigma_{\mathsf{Min}}(\rho) = (d, \delta)$ . If  $\rho_+ \in$ 916  $\mathsf{FPlays}^{\mathsf{Min}}_{\mathcal{G}}$ , we also let  $f(\rho_+) = \rho'_+$ , and otherwise we let  $g(\rho'_+) = \rho_+$ . Symmetrically, consider 917  $\rho' \in \mathsf{FPlays}_{\mathcal{C}_N(\mathcal{G})}^{\mathsf{Max}}$  of length n, and  $\rho = g(\rho')$ . For all possible decisions  $(d', \delta')$ , by timed 918 bisimulation, there exists a decision  $(d, \delta)$  in the prefix  $\rho$  such that the respective extended 919 plays  $\rho'_+$  and  $\rho_+$  are 1/N-close. We then let  $g(\rho'_+) = \rho_+$  if  $\rho_+ \in \mathsf{FPlays}_{\mathcal{G}}^{\mathsf{Max}}$  and  $f(\rho_+) = \rho'_+$ 920 otherwise. We extend the definition of f and g arbitrarily for other prefixes of plays. The 921 properties above are then trivially verified. 922

We then fix a strategy  $\sigma_{Max}$  of Max in the game  $\mathcal{G}$ , which determines a unique play play $((\ell, \nu), \sigma_{Max}, \sigma_{Min})$ . We construct a strategy  $\sigma'_{Max}$  of Max in the game  $\mathcal{C}_N(\mathcal{G})$  by building the unique play play $(((\ell, r, v), v), \sigma'_{Max}, \sigma'_{Min})$  we will be interested in, such that each of its

prefixes is in relation, via f or g, to the associated prefix of  $play((\ell, \nu), \sigma_{Max}, \sigma_{Min})$ . Thus, we only need to consider a prefix of play  $\rho' \in \mathsf{FPlays}_{\mathcal{C}_N(\mathcal{G})}^{\mathsf{Max}}$  that starts in  $((\ell, r, \nu), \nu)$  and is consistent with  $\sigma'_{\mathsf{Min}}$ , and  $\sigma'_{\mathsf{Max}}$  built so far. Consider the play  $\rho = g(\rho')$ , starting in  $(\ell, \nu)$  and consistent with  $\sigma_{\mathsf{Min}}$ , and  $\sigma_{\mathsf{Max}}$  (by assumption). For the decision  $(d, \delta) = \sigma_{\mathsf{Max}}(\rho)$  (letting  $\rho_+$  be the extended prefix), the definition of f and g ensures that there exists a decision  $(d', \delta')$  after  $\rho'$  that results in an extended play  $\rho'_+$  that is 1/N-close, via f or g, with  $\rho_+$ . We thus can choose  $\sigma'_{\mathsf{Max}}(\rho') = (d', \delta')$ .

We finally have built two plays  $play((\ell, \nu), \sigma_{Max}, \sigma_{Min})$  and  $play((\ell', \nu'), \sigma'_{Max}, \sigma'_{Min})$  that are 1/N-close, as needed, which concludes this proof.

Proof of Lemma 12. By construction, the approximated value is piecewise linear with one piece per 1/N-region. To prove the Lipschitz constant, it is then sufficient to bound the difference between  $\operatorname{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v), v)$  and  $\operatorname{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v'), v')$ , for v and v' two corners of a 1/N-region r. We can pick any valuation  $\nu$  in r and apply Lemma 11 twice, between  $\nu$  and v, and between  $\nu$  and v'. We obtain  $|\operatorname{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v), v) - \operatorname{Val}_{\mathcal{C}_N(\mathcal{G})}((\ell, r, v'), v')| \leq$  $2\mathbf{B}/N = 2||v - v'||_{\infty}\mathbf{B}.$ 

## <sup>941</sup> D.2 Computing the value of an acyclic WTG

Note that for a piecewise linear functions with finitely many pieces, being K-Lipschitzcontinuous over regions is equivalent to being continuous over regions and having all partial derivatives bounded by K in absolute value.

▶ Lemma 22. If for all  $\ell \in L$ ,  $V_{\ell}$  is piecewise linear with finitely many pieces that have all their partial derivatives bounded by K in absolute value, then for all  $\ell \in L$ ,  $\mathcal{F}(V)_{\ell}$  is continuous over regions and piecewise linear with finitely many pieces that have all their partial derivatives bounded by  $\max(K, |wt(\ell)| + (n-1)K)$  in absolute value.

**Proof.** We will show that for every region r,  $\mathcal{F}(V)$  restricted to r has those properties. 949 Note that they are transmitted over finite min and max operations. The continuity over 950 regions is easy to prove because it is stable by inf and sup. We now use the notations 951 and definitions of [1] to bound the partial derivatives. There exists a partition cost function 952 (P, F) that represents V, with P an n-dimensional nested tube partition and F a mapping 953 from the leaf nodes of P to linear expressions over variables in X. Intuitively, P defines 954 a finite arborescence of convex spaces, defined by linear inequalities, whose root is the 955 whole region r and whose leaves partition r into *cells*. A crucial property of those cells 956 ([1, Theorem 4]) is that, for a given valuation  $\nu$ , the delays t that need to be considered in 957 the sup or inf operation of  $\mathcal{F}(V)_{(\ell,\nu)}$  correspond to the intersection points of the diagonal 958 half line containing the time successors of  $\nu$  and borders of cells (if  $\nu^b$  is such a valuation, 959  $t = \|\nu^b - \nu\|_{\infty}$  is the associated delay). In particular, there is a finite number of such 960 borders, and the final  $\mathcal{F}(V)_{\ell}$  function can be written as a finite nesting of finite min and 961 max operations over linear terms, each corresponding to a choice of delay and a transition 962 to take. Formally, there are several cases to consider to define those terms, depending on 963 delay and transition choices. For each available transition  $\delta$ , those terms can either be: 964

**1.** If a delay 0 is taken and all clocks in  $Y \subseteq X$  are reset by  $\delta$ , then

 $\mathsf{y}_{\mathsf{66}} \qquad \mathsf{wt}_{\Sigma}((\ell,\nu) \xrightarrow{0} (\ell,\nu) \xrightarrow{\delta} (\ell',\nu[Y:=0])) = \mathsf{wt}_{\Sigma}(\delta) + V_{(\ell',\nu[Y:=0])}$ 

<sup>967</sup> **2.** If a delay 
$$t > 0$$
 (leading to valuation  $\nu^b$  on border  $B$ ) is taken and the clocks in  $Y$  are reset

by  $\delta$ , then  $\mathsf{wt}_{\Sigma}((\ell,\nu) \xrightarrow{t} (\ell,\nu^b) \xrightarrow{\delta} (\ell',\nu^b[Y:=0])) = \mathsf{wt}_{\Sigma}(\ell) \times t + \mathsf{wt}_{\Sigma}(\delta) + V_{(\ell',\nu^b[Y:=0])}$ 



**Figure 3** A tubular cell *c* as described in the proof of Lemma 22. Dashed lines bound the cell *c*, dotted lines are proof constructions.

In the first case, the resulting partial derivatives are 0 for clocks in Y, and the same as the partial derivatives in  $V_{\ell'}$  for all other clocks, which allows us to conclude that they are bounded by K. We now consider the second case. We argue that the second case could be decomposed as a delay followed by a transition of the first case, meaning that we can assume  $Y = \emptyset$  without loss of generality.

There are again two cases: the border B being inside a region or on the frontier of a region.

If the border is not the frontier of a region, it is the intersection points of two affine pieces of  $V_{\ell'}$  whose equations (in the space  $\mathbb{R}^{n+1}$  whose *n* first coordinates are the clocks  $(x_1, \ldots, x_n)$  and the last coordinate correspond to the value  $V_{\ell'}(x_1, \ldots, x_n)$ ) can be written  $y = \sum_{i=1}^n a_i x_i + b$  (before the border) and  $y = \sum_{i=1}^n a'_i x_i + b'$  (after the border). Therefore, valuations of the borders all fulfil the equation

981 
$$\sum_{i=1}^{n} (a'_i - a_i)x_i + b - b' = 0$$
(2)

We let  $A = \sum_{i=1}^{n} (a'_i - a_i)$ . Consider that  $\ell$  is a location of Min (the very same reasoning applies to the case of a location of Max). Since  $\mathcal{F}$  computes an infimum, we know that the function mapping the delay t to the weight obtained from reaching  $\nu + t$  is decreasing before the border and increasing after. These functions are locally affine which implies that their slopes verify:

$$\mathsf{wt}(\ell) + \sum_{i=1}^{n} a_i \leq 0 \quad \text{and} \quad \mathsf{wt}(\ell) + \sum_{i=1}^{n} a'_i \geq 0.$$
(3)

We deduce from these two inequalities that  $A \ge 0$ . The case where A = 0 would correspond to the case where the border contains a diagonal line, which is forbidden, and A > 0. Consider now a valuation of coordinates  $\nu = (x_1, \ldots, x_n)$  and another valuation of coordinates  $\nu' = (x_1, \ldots, x_{k-1}, x_k + \lambda, x_{k+1}, \ldots, x_n)$ . The delays t and t' needed to arrive to the border starting from these two valuations are such that  $\nu + t$  and  $\nu' + t'$  both verify (2). We can then deduce that  $t' - t = \lambda \frac{a_k - a'_k}{A}$ . It is now possible to compute the partial derivative of

 $\mathcal{F}(V)_{\ell}$  in the k-th coordinate using 994

$$\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = \frac{\operatorname{wt}(\ell)(t'-t') + V_{\ell',\nu'+t'} - V_{\ell',\nu+t}}{\lambda}.$$

We may compute it by using the equations of the affine pieces before or after the border. 996 We thus obtain 997

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$$\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = \frac{a_k - a'_k}{A} (\operatorname{wt}(\ell) + \sum_{i=1}^n a_i) + a_k$$
$$\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = \frac{a_k - a'_k}{A} (\operatorname{wt}(\ell) + \sum_{i=1}^n a'_i) + a'_k$$

999 1000

In the case where  $a_k \ge a'_k$ , the first equation, with (3), allows us to obtain that the partial 1001 derivative is at most  $a_k$ . We may then lower  $wt(\ell)$  by  $-\sum_{i=1}^n a'_i$  to obtain that the partial 1002 derivative is at least  $a'_k$ . Since  $a_k$  and  $a'_k$  are bounded in absolute value by K, so is the 1003 partial derivative. We get the same result by reasoning on the second equation if  $a'_k \ge a_k$ . 1004

We now come back to the case where the border is on the frontier of a region. Then, it 1005 is a segment of a line of equation  $x_k = c$  for some k and c.  $V_{\ell'}$  contains at most three values 1006 for points of B: The limit coming from before the border, the value at the border, and the 1007 limit coming from after the border. The computation of  $\mathcal{F}(V)$  computes values obtained 1008 from all three and takes the min (or the max). 1009

Now, let  $y = \sum_{i=1}^{n} a_i x_i + b$  be the equation defining the linear piece of  $V_{\ell'}$  before the 1010 border (resp. at the border, after the border). Consider now a valuation of coordinates  $\nu =$ 1011  $(x_1,\ldots,x_n)$  and another valuation of coordinates  $\nu' = (x_1,\ldots,x_{j-1},x_j+\lambda,x_{j+1},\ldots,x_n)$ . 1012 The delays t and t' needed to arrive to the border starting from these two valuations are 1013 such that  $\nu + t$  and  $\nu' + t'$  both verify  $x_k = c$ . We can then deduce that t' - t = 0 if  $j \neq k$ 1014 and  $t' - t = -\lambda$  if j = k. It is now possible to compute the partial derivative of  $\mathcal{F}(V)_{\ell}$  in 1015 the *j*-th coordinate using 1016

1017 
$$\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = \frac{\mathsf{wt}(\ell)(t'-t') + V_{\ell',\nu'+t'} - V_{\ell',\nu+t}}{\lambda}.$$

We may compute it by using the equations of the linear piece before the border (resp. at the 1018 border, after the border). Then,  $V_{\ell',\nu+t} = \sum_{i=1}^{n} a_i(x_i+t) + b = (\sum_{i=1 \neq k}^{n} a_i(x_i+t)) + a_k c + b + b$ 1019 and  $V_{\ell',\nu'+t'} = (\sum_{i=1 \neq k}^{n} a_i(x_i + t')) + a_k c + b$ . We thus obtain 1020

1021

$$\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = a_j \text{ if } j \neq k$$

 $\frac{\mathcal{F}(V)_{\ell,\nu'} - \mathcal{F}(V)_{\ell,\nu}}{\lambda} = -\mathsf{wt}(\ell) - \sum_{i=1, i \neq k}^{n} a_i \text{ otherwise}$ 

Then, the partial derivatives are bounded, in absolute value, by  $|wt(\ell)| + (n-1)K$ . 1024

1025

As a corollary, we can now obtain Lemma 13, or more precisely: 1026

**Lemma 23.** Consider an acyclic WTG  $\mathcal{G}$  of depth i with all the output weights being 1027 K-Lipschitz-continuous over each region (and piecewise linear, with finitely many pieces). 1028 Then, 1029

 $if |X| = 1, \ \mathsf{Val}_{\mathcal{G}} = \mathsf{Val}_{\mathcal{G}}^{i} \ is \ \max(K, w_{\max}^{L}) \text{-} Lipschitz\text{-}continuous \ over \ regions; }$  $if |X| = 2, \ \mathsf{Val}_{\mathcal{G}} = \mathsf{Val}_{\mathcal{G}}^{i} \ is \ (i * w_{\max}^{L} + K) \text{-} Lipschitz\text{-}continuous \ over \ regions; }$ 1030

1031

otherwise, 
$$\operatorname{Val}_{\mathcal{G}} = \operatorname{Val}_{\mathcal{G}}^{i}$$
 is  $(w_{\max}^{L} \frac{(|X|-1)^{i}-1}{|X|-2} + (|X|-1)^{i}K)$ -Lipschitz-continuous over regions.



# 1034 D.3 Example of an execution of the approximation scheme

**Figure 4** A weighted timed game  $\mathcal{G}$  with two clocks x and y, and the portion of its region game  $\mathcal{R}(\mathcal{G})$  accessible from configuration  $(\ell_0, (0, 0))$ . Locations of Min (resp. Max) are depicted as circles (resp. squares). The states of  $\mathcal{R}(\mathcal{G})$  are labeled by their associated region, location and weight, and transitions are labeled by a representation of their guards and resets. Since each location  $\ell$  of  $\mathcal{G}$  leads to a unique states  $(\ell, r)$  of  $\mathcal{R}(\mathcal{G})$ , we will refer to states by their associated location label.

We are given the WTG  $\mathcal{G}$  in Figure 4 and  $\varepsilon \in \mathbb{Q}_{>0}$ , and want to compute an  $\varepsilon$ approximation of its value in location  $\ell_0$  for the valuation (x=0, y=0), denoted  $\operatorname{Val}_{\mathcal{G}}(\ell_0, (0, 0))$ . In this example, we will use  $\varepsilon=15$  because the computations would not be readable with a smaller precision.  $\mathcal{R}(\mathcal{G})$  contains one SCC  $\{\ell_1, \ell_2, \ell_3, \ell_4\}$ , made of two simple cycles.  $\pi_1 = \ell_1 \to \ell_2 \to \ell_1$  is a positive cycle (all plays following  $\pi_1$  have cumulated weight in the interval (1,3)) and  $\pi_2 = \ell_1 \to \ell_3 \to \ell_4 \to \ell_1$  is a 0-cycle (all plays following  $\pi_2$  have cumulated weight 0). This can be checked by Lemma 2.

Therefore,  $\mathcal{R}(\mathcal{G})$  only contains non-negative SCCs and is almost-divergent. Since all states are in the attractor of Min towards  $L_T$ , all cycles are non-negative and the output weight function is bounded (on all reachable regions), there are no configurations in  $\mathcal{R}(\mathcal{G})$ with value  $+\infty$  or  $-\infty$ .

We let the kernel K be the sub-game of  $\mathcal{R}(\mathcal{G})$  defined by  $\pi_2$ , and we construct a semiunfolding  $\mathcal{T}(\mathcal{G})$  of  $\mathcal{R}(\mathcal{G})$  of equivalent value. Following Appendix C, we should unfold the game until every stopped branch contains a state seen at least  $3|\mathcal{R}(\mathcal{G})|w_{\max}^e + 2\sup |wt_T| + 2 =$ 3 \* 3 \* 4 + 2 \* 1 = 38 times. We will unfold with bound 4 instead of 38 for readability (it is enough on this example). Thus the infinite branch  $(\ell_1 \ell_2)^{\omega}$  is stopped when  $\ell_1$  is reached for the fourth time, as depicted in Figure 5.



**Figure 5** The kernel K (with input state  $\ell_1$ ), and a semi-unfolding  $\mathcal{T}(\mathcal{G})$  such that  $\operatorname{Val}_{\mathcal{G}}(\ell_0, (0, 0)) = \operatorname{Val}_{\mathcal{T}(\mathcal{G})}(\ell_0, (0, 0))$ . We denote  $\ell_i, \ell'_i$  and  $\ell''_i$  the locations in K, K' and K''.

Let us now compute an approximation of  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}$ . Let us first remove the states of value + $\infty$ :  $\ell_1'''$  and  $\ell_2''$ . Then, we start at the bottom and compute an  $(\varepsilon/3)$ -approximation of the value of  $\ell_1''$  in the game defined by  $\mathsf{K}_{\ell_1}''$  and its output transition to  $\ell_t''$ . Following Section 5, we should use  $N \ge 3(4+1)/\varepsilon$  and compute values in the 1/N-corners game  $\mathcal{C}_N(\mathsf{K}_{\ell_1}'')$  in order to obtain an  $(\varepsilon/3)$ -approximation of the value function. For  $\varepsilon = 15$  we will use N = 1(in this case the computation happens to be exact and would also hold with a small  $\varepsilon$ ) We construct this corner game, and obtain the finite (untimed) weighted game in Figure 6.

We can compute the values in this game to obtain  $\operatorname{Val}(c_1) = 1$  and  $\operatorname{Val}(c_1) = 3$ . We then define a value for every configuration in state  $\ell_1''$  by linear interpolation, obtaining  $(x, y) \rightarrow 3-2y$  (which happens to be exactly  $(x, y) \rightarrow \operatorname{Val}_{\mathcal{T}(\mathcal{G})}(\ell_1'', (x, y))$  in this case, but would only be an  $\varepsilon/3$ -approximation of it in general). Now, we can compute an  $\varepsilon/3$ -approximation of Val $_{\mathcal{T}(\mathcal{G})}(\ell_2')$  with one step of value iteration, obtaining  $(x, y) \rightarrow \operatorname{inf}_{0 < d < 2-x}(-1) * d + 1 + 3 - 2(0 + d) = 3x - 2$ .

The next step is computing an  $\varepsilon/3$ -approximation of the value of  $\ell'_1$  in the game defined by  $\mathsf{K}'_{\ell_1}$  and its output transitions to  $\ell'_t$  and  $\ell'_2$ , of respective output weight functions  $(x, y) \to x$ and  $(x, y) \to 3x - 2$ . This will give us an  $2\varepsilon/3$ -approximation of  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell'_1)$ .

Following Section 5 once again, we should use  $N \ge 3(5+3)/\varepsilon$  and compute values 1068 in the 1/N-corners game  $\mathcal{C}_N(\mathsf{K}'_{\ell_1})$ . For  $\varepsilon = 15$  this gives N = 2 (which will once again 1069 keep the computation exact). We can construct a finite (untimed) weighted game as in 1070 Figure 6, and obtain a value for each 1/2-corner of state  $\ell_1'$ : On the 1/2-region (0 < y < 1071 1/2, x = 0, corner (0,0) has value 2 and corner (0,1/2) has value 2. On the 1/2-region 1072 (y = 1/2, x = 0), corner (0, 1/2) has value 2. On the 1/2-region (1/2 < y < 1, x = 0), 1073 corner (0, 1/2) has value 2 and corner (0, 1) has value 1. From these results, we define 1074 a piecewise-linear function by interpolating the values of corners on each 1/2-region, and 1075

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**Figure 6** The finite weighted game obtained from  $C_1(\mathsf{K}''_{\ell_1})$ , where  $c_i$  and  $c'_i$  are the corners of  $\ell''_i$  in  $\mathcal{T}(\mathcal{G})$ .

1076 obtain 
$$(x, y) \to \begin{cases} 2 & \text{if } y \leq 1/2 \\ 3 - 2y & \text{otherwise} \end{cases}$$
, as depicted in Figure 7.



**Figure 7** The value function  $(x, y) \to \text{Val}_{\mathcal{T}(\mathcal{G})}(\ell'_1, (x, y))$ , projected on x = 0. Black dots represent the values obtained for 1/2-corners using the corner-points abstraction.

<sup>1077</sup> This gives us an  $2\varepsilon/3$ -approximation of  $(x, y) \to \operatorname{Val}_{\mathcal{T}(\mathcal{G})}(\ell'_1, (x, y))$  (in fact exactly <sup>1078</sup>  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}(\ell'_1)$ ). Now, we can compute an  $2\varepsilon/3$ -approximation of  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}(\ell_2)$  on region (1 < <sup>1079</sup> x < 2, y = 0) with one step of value iteration, obtaining :

$$(x,y) \to \inf_{\substack{0 < d < 2-x}} \begin{cases} 3-d & \text{if } d \leq 1/2\\ 4-3d & \text{otherwise} \end{cases} = \begin{cases} 3x-2 & \text{if } x \leq 3/2\\ x+1 & \text{otherwise} \end{cases}$$

Then, we need to compute an  $\varepsilon/3$ -approximation of the value of  $\ell_1$  in the game defined by  $\mathsf{K}_{\ell_1}$  and its output transitions to  $\ell_t$  and  $\ell_2$ , of respective output weight functions  $(x, y) \to x$ and  $(x, y) \to 3x - 2$  if  $x \leq 3/2, x + 1$  otherwise. This will give us an  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_1)$ .

Following Section 5 one last time, we should use  $N \ge 3(5+3)/\varepsilon$  and compute values in the 1/N-corners game  $C_N(\mathsf{K}_{\ell_1})$ . This time, let us use N = 3 to showcase an example where the computed value is not exact. We can construct a finite (untimed) weighted game as in Figure 6, and obtain a value for each 1/3-corner of state  $\ell'_1$ . From these results, we define a piecewise-linear function by interpolation, as depicted in Figure 8.



**Figure 8** The value function  $(x, y) \to \mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_1, (x, y))$ , projected on x = 0, is depicted in red. Black dots represent the values obtained for 1/3-corners using the corner-points abstraction, and the derived approximation of the value function is depicted in blue

Finally, from this  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_1)$ , we can compute an  $\varepsilon$ -approximation of  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_0)$  using one step of value iteration, and conclude. On our example this ensures  $\mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_0, (0, 0)) = \sup_{0 \le d \le 1} \mathsf{Val}_{\mathcal{T}(\mathcal{G})}(\ell_1, (0, d)) \in [2 - \varepsilon, 2 + \varepsilon].$ 

# **D.4** Complexity analysis

We will express complexities according to several parameters: |L|, |X|, greatest guard 1094 constant M, greatest location and transition weight constants  $w_{\max}^L$  and  $w_{\max}^{\Delta}$ . We also 1095 need to keep track of the output weight functions' characteristics. Recall that the output 1096 weight functions must be piecewise linear with finitely many pieces and Lipschitz-continuous 1097 over regions. We define three parameters, its Lipschitz constant K, its number of lin-1098 ear pieces J and a bound U (that we call additive bound) on its additive constant, such 1099 that if  $(x_1, \ldots, x_{|X|}) \to \sum_{i=1}^{|X|} a_i x_i + b$  defines one of those linear pieces, then  $|b| \leq U$  and 1100  $\forall 1 \leq i \leq |X|, |a_i| \leq K.$ 1101

<sup>1102</sup> Note that |L|, |X| and J are all polynomial in the size of the input, but M,  $w_{\max}^L$ ,  $w_{\max}^{\Delta}$ , <sup>1103</sup> K and U are exponential in the size of the input if constants are encoded in binary.

<sup>1104</sup> We start with simple estimates:

Number of regions |Reg(X, M)|: Polynomial in M, exponential in |X|.

- 1106 In Number of 1/N-regions  $|\text{Reg}_N(X, M)|$ : Polynomial in M and N, exponential in |X|.
- 1107 In Number of 1/N-corners: Polynomial in M and N, exponential in |X|.
- Maximum weight of a timed transition  $w_{\max}^e$ : Polynomial in M,  $w_{\max}^L$  and  $w_{\max}^\Delta$ .
- 1109 Maximum output weight sup  $|wt_T|$ : Polynomial in M, U, |X| and K.

# 1110 **D.4.1 Tree**

Let us recall the complexity of the value iteration algorithm, used to compute the exact value of an acyclic WTG:

- <sup>1113</sup> Input: An acyclic game of depth i.
- <sup>1114</sup> Algorithm scheme: Computes  $\mathcal{F}^i(V^0) = \mathsf{Val}^i = \mathsf{Val}$ .
- <sup>1115</sup> Output: A K'-Lipschitz-continuous function with J' pieces and additive bound U' that is <sup>1116</sup> the game's value.
- K' is of the form KK'' with K'' polynomial in  $w_{\text{max}}^L$  and |X| and exponential in *i*.
- J' is of the form  $J^{|X|} J''$  with J'' polynomial in M and |L| and exponential in |X| and i.
- 1119 = U' is of the form U + U'' with U'' polynomial in M,  $w_{\max}^L$ ,  $w_{\max}^\Delta$  and i.
- 1120 Complexity: exponential in i and the size of the input.

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### 1121 D.4.2 Kernel

- <sup>1122</sup> Input: A kernel WTG, a precision  $\varepsilon > 0$ .
- Algorithm scheme: Solves optimal reachability on the finite 1/N-corner game with N polynomial in  $1/\varepsilon$ ,  $w_{\max}^L$ , |L|, M and K and exponential in |X|.
- <sup>1125</sup> Output: A K'-Lipschitz-continuous value function with J' pieces and additive bound U'<sup>1126</sup> that is an  $\varepsilon$ -approximation of the game's value.
- K' is of the form KK'' with K'' polynomial in |L|,  $w_{\max}^L$  and M and exponential in |X|.
- J' is polynomial in  $1/\varepsilon$ ,  $w_{\text{max}}^L$ , |L|, M and K and exponential in |X| (in particular, it is independent in J).
- <sup>1130</sup> = U' of the form U + U'' with U'' polynomial in  $1/\varepsilon$ ,  $w_{\text{max}}^L$ ,  $w_{\text{max}}^\Delta$ , |L|, M and K and <sup>1131</sup> exponential in |X|.
- 1132 Complexity: polynomial in  $1/\varepsilon$ ,  $w_{\max}^L$ ,  $w_{\max}^\Delta$ , |L|, M and K and exponential in |X|.

#### 1133 D.4.3 Semi-unfolding

<sup>1134</sup> We now stack several kernel and tree parts to form a semi-unfolding of a region game.

Input: A semi-unfolding of branch depth D, a precision  $\varepsilon > 0$ .

Algorithm scheme: value iteration for the trees and region-based for the kernels (on 1/Ncorners), with precision  $\varepsilon/D$ . In order to bound N, we need to bound the Lipschitz constants along the whole computation. We can recursively show that along this computation the Lipschitz constants, additive constants and number of pieces do not grow too much, and obtain global bounds:

- we can bound all Lipschitz constants by K K'' with K'' polynomial in |L|,  $w_{\text{max}}^L$ , M and exponential in |X| and D.
- we can bound all number of pieces by  $J^{|X|} J''$  with J'' polynomial in  $1/\varepsilon$ , M, |L|,  $w_{\max}^L$ , and K and exponential in |X| and D.
- we can bound all additive constants by U + U'' with U'' polynomial in  $1/\varepsilon$ ,  $w_{\max}^L$ ,  $w_{\max}^{\Delta}$ , |L|, M and K and exponential in |X| and D.

<sup>1147</sup> Therefore, N can be chosen polynomial in  $1/\varepsilon$ ,  $w_{\text{max}}^L$ , |L|, M and K and exponential in |X|<sup>1148</sup> and D.

- <sup>1149</sup> Output: A K'-Lipschitz-continuous value function with J' pieces and additive bound U'<sup>1150</sup> that is an  $\varepsilon$ -approximation of the game's value. K', J', U' are bounded by their respective
- 1151 global bound.
- <sup>1152</sup> Complexity: polynomial in  $1/\varepsilon$  and exponential in the size of the input and D.

#### 1153 D.4.4 Almost divergent game

<sup>1154</sup> Input: An almost divergent game, a precision  $\varepsilon > 0$ .

Algorithm scheme: First, compute the region game's SCCs, and remove  $+ -\infty$  locations. Then, perform the semi-unfolding of the game, of depth D whose value is equivalent to that of the original game, with D polynomial in M, |L|,  $w_{\text{max}}^L$ ,  $w_{\text{max}}^\Delta$ , K, U and exponential in |X|.

<sup>1159</sup> Output: A K'-Lipschitz-continuous value function with J' pieces and additive bound U'<sup>1160</sup> that is an  $\varepsilon$ -approximation of the game's value.

K' is exponential in M, |L|,  $w_{\max}^L$ ,  $w_{\max}^\Delta$ , K, U and doubly-exponential in |X|.

J' is polynomial in J,  $1/\varepsilon$ , exponential in M, |L|,  $w_{\text{max}}^L$ ,  $w_{\text{max}}^\Delta$ , K, U and doublyexponential in |X|.

<sup>1164</sup> = U' is polynomial in  $1/\varepsilon$  and exponential in M, |L|,  $w_{\text{max}}^L$ ,  $w_{\text{max}}^\Delta$ , K, U and doubly-<sup>1165</sup> exponential in |X|

<sup>1166</sup> Complexity: polynomial in  $1/\varepsilon$ , exponential in the size of the input and M, K, U,  $w_{\text{max}}^L$ <sup>1167</sup> and  $w_{\text{max}}^{\Delta}$  and doubly-exponential in |X|.

# **E** Proofs of the symbolic approximation scheme (Section 6)

<sup>1169</sup> This section is devoted to the proof of Theorem 14.

Notice that configurations with value  $+\infty$  are stable through value iteration, and do not affect its other computations. Since we assumed the absence of value  $-\infty$ , we will therefore consider in the following that all configurations have finite value in  $\mathcal{G}$ .

<sup>1173</sup> Consider a game  $\mathcal{G}$  that is a kernel. Following Section 5, we can define an integer N<sup>1174</sup> such that solving the untimed weighted game  $\mathcal{C}_N(\mathcal{G})$  computes an  $\varepsilon/2$ -approximation of the <sup>1175</sup> value of 1/N corners.

Using the results of [14] for untimed weighted games, we know that those values are obtained after a finite number of steps of (the untimed version of) the value iteration operator. More precisely, if one considers a number of iterations  $P = |L||\operatorname{Reg}_{N}(X,M)|(|X| + 1)(2(|L||\operatorname{Reg}_{N}(X,M)|(|X|+1)-1)w_{\max}^{e}+1)$ , then  $\operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}^{P}((\ell,r,v),v) = \operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}((\ell,r,v),v)$ . From this observation, we deduce the following property of P:

Lemma 24. If  $\mathcal{G}$  is a kernel with no infinite value,  $|\mathsf{Val}_{\mathcal{G}}(\ell,\nu) - \mathsf{Val}_{\mathcal{G}}^{P}(\ell,\nu)| \leq \varepsilon$  for all configurations  $(\ell,\nu)$  of  $\mathcal{G}$ .

**Proof.** We already know that  $\operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}^{P}((\ell, r, v), v) = \operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}((\ell, r, v), v)$  for all configurations  $((\ell, r, v), v)$  of  $\mathcal{C}_{N}(\mathcal{G})$ . Moreover, Section 5 ensures  $|\operatorname{Val}_{\mathcal{G}}(\ell, \nu) - \operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}((\ell, r, v), v)| \leq \varepsilon/2$  whenever  $\nu$  is in the 1/N-region r. Therefore, we only need to prove that  $|\operatorname{Val}_{\mathcal{G}}^{P}(\ell, \nu) - \operatorname{Val}_{\mathcal{C}_{N}(\mathcal{G})}((\ell, r, v), v)| \leq \varepsilon/2$  to conclude. This is a simple rewriting of Lemma 11 that holds with exactly the same proof, since Lemma 10 does not depend on the length of the plays  $\rho$ and  $\rho'$ , and both runs reach the target state in the same step, i.e. both before or after the horizon of P steps.

Once we know that value iteration converges on kernels, we can use the semi-unfolding of Section 4 to prove that it also converges on non-negative SCCs when all values are finite.

Lemma 25. If  $\mathcal{G}$  is a non-negative SCC with no infinite value, we can compute P such that  $|\operatorname{Val}_{\mathcal{G}}(\ell,\nu) - \operatorname{Val}_{\mathcal{G}}^{P}(\ell,\nu)| \leq \varepsilon$  for all configurations  $(\ell,\nu)$  of  $\mathcal{G}$ .

**Proof.** Consider a non-negative SCC's  $\mathcal{G}$ , a precision  $\varepsilon$ , and an initial configuration  $(\ell_0, \nu_0)$ . 1194 Let  $\mathcal{T}(\mathcal{G})$  be its finite semi-unfolding (obtained from the labelled tree T, as in Appendix C), 1195 such that  $\mathsf{Val}_{\mathcal{G}}(\ell_0,\nu_0) = \mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0,r_0),\nu_0)$ . Let  $\alpha$  be the maximum number of kernels 1196 along a branch of T. Let P' be an integer such that for all kernels K in  $\mathcal{T}(\mathcal{G})$ ,  $|\mathsf{Val}_{\mathsf{K}}(\ell,\nu) - \mathsf{Val}_{\mathsf{K}}(\ell,\nu)|$ 1197  $|Va|_{K}^{P'}(\ell,\nu)| \leq \varepsilon/\alpha$  for all configurations  $(\ell,\nu)$  of  $\mathcal{G}$ . We can find such a P' by using Lemma 24. 1198 Create  $\mathcal{T}'(\mathcal{G})$  from T by applying the method used to create  $\mathcal{T}(\mathcal{G})$  but replace every kernel 1199 by its complete P'-unfolding instead. This implies that  $\mathcal{T}'(\mathcal{G})$  is a tree, of bounded depth 1200 P (at most the depth of T times P'). Then  $|\mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) - \mathsf{Val}_{\mathcal{T}'(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)| \leq \varepsilon$ . 1201 This holds because the value function is 1-Lipschitz-continuous with regards to the output 1202 weight function, so imprecision builds up additively. 1203

<sup>1204</sup> Consider now  $\mathcal{T}''(\mathcal{G})$  the (complete) unfolding of  $\mathcal{R}(\mathcal{G})$  with unfolding depth P, where ker-<sup>1205</sup> nels are also unfolded. By construction,  $\mathsf{Val}_{\mathcal{T}''(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) = \mathsf{Val}_{\mathcal{T}''(\mathcal{G})}^P((\tilde{\ell}_0, r_0), \nu_0)$ . Then, <sup>1206</sup> we can prove that  $\mathsf{Val}_{\mathcal{T}''(\mathcal{G})}^P((\tilde{\ell}_0, r_0), \nu_0) = \mathsf{Val}_{\mathcal{G}}^P(\ell_0, \nu_0)$  (same strategies at bounded horizon

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<sup>1207</sup> P), which implies  $\mathsf{Val}_{\mathcal{R}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \mathsf{Val}_{\mathcal{T}''(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$  (monotonicity of  $\mathsf{Val}^k$ ). By <sup>1208</sup> another monotonicity argument (because  $\mathcal{T}''$  contains  $\mathcal{T}'$  as a prefix), we can also prove <sup>1209</sup>  $\mathsf{Val}_{\mathcal{T}''(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) \leq \mathsf{Val}_{\mathcal{T}'(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0).$ 

Bringing everything together we obtain  $|\mathsf{Val}_{\mathcal{G}}^{P}(\ell_{0},\nu_{0}) - \mathsf{Val}_{\mathcal{G}}(\ell_{0},\nu_{0})| \leq \varepsilon$ .

Proving the same property on non-positive SCCs requires more work, because the semiunfolding gives stopped leaves  $-\infty$  as output weight (for symmetry reasons), which doesn't integrate well with value iteration (initialisation at  $+\infty$  on non-target states).

Lemma 26. If  $\mathcal{G}$  is a non-positive SCC with no infinite value, there exists P such that |Val<sub>G</sub>( $\ell, \nu$ ) − Val<sup>P</sup><sub>G</sub>( $\ell, \nu$ )|  $\leq \varepsilon$  for all configurations ( $\ell, \nu$ ) of  $\mathcal{G}$ .

**Proof.** Consider a non-positive SCC  $\mathcal{G}$ , a precision  $\varepsilon$ , and an initial configuration  $(\ell_0, \nu_0)$ . Let  $\mathcal{T}(\mathcal{G})$  be its finite semi-unfolding (obtained from the labelled tree T, as in Appendix C), such that  $\mathsf{Val}_{\mathcal{G}}(\ell_0, \nu_0) = \mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$ .

We now change T, by adding a subtree under each stopped leaf: the complete un-1219 folding of  $\mathcal{R}(\mathcal{G})$ , starting from the stopped leaf, of depth  $|\mathcal{R}(\mathcal{G})|$ . Let us name  $T^+$  this 1220 unfolding tree. We then construct  $\mathcal{T}^+(\mathcal{G})$  as before, based on  $T^+$ . Since we are in a non-1221 positive SCC,  $\mathcal{T}^+(\mathcal{G})$  must have output weight  $-\infty$  on its stopped leaves. It is easy to 1222 see that  $\operatorname{Val}_{\mathcal{G}}(\ell_0, \nu_0) = \operatorname{Val}_{\mathcal{T}^+(\mathcal{G})}((\ell_0, r_0), \nu_0)$  still holds (the proof was based on branches 1223 being long enough, and we increased the lengths). We now perform a small but crucial 1224 change: the output weight of stopped leaves in  $\mathcal{T}^+(\mathcal{G})$  is set to  $+\infty$  instead of  $-\infty$ . Trivi-1225 ally  $\operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\ell_0, r_0), \nu_0) \leq \operatorname{Val}_{\mathcal{T}^+(\mathcal{G})}((\ell_0, r_0), \nu_0)$  (we increased the output weight function). 1226 Let us prove that  $\operatorname{Val}_{\mathcal{T}^+(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) \leq \operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0).$ 1227

For a fixed  $\eta > 0$ , consider  $\sigma_{\mathsf{Min}}$  a  $\eta$ -optimal strategy for player Min in  $\mathcal{T}(\mathcal{G})$ . Let us 1228 define  $\sigma_{Min}^+$ , a strategy for Min in  $\mathcal{T}^+(\mathcal{G})$ , by making the same choice as  $\sigma_{Min}$  on the common 1229 prefix tree, and once a node that is a stopped leaf in  $\mathcal{T}(\mathcal{G})$  is reached, we switch to a 1230 memoryless attractor strategy of Min towards target states. Consider any strategy  $\sigma^+_{\mathsf{Max}}$ 1231 of Max in  $\mathcal{T}^+(\mathcal{G})$ , and let  $\sigma_{Max}$  be its projection in  $\mathcal{T}(\mathcal{G})$ . Let  $\rho^+$  denote the (maximal) 1232 play  $\operatorname{\mathsf{play}}_{\mathcal{T}^+(\mathcal{G})}(((\ell_0, r_0), \nu_0), \sigma_{\operatorname{\mathsf{Min}}}^+, \sigma_{\operatorname{\mathsf{Max}}}^+))$ , and  $\rho$  be  $\operatorname{\mathsf{play}}_{\mathcal{T}(\mathcal{G})}(((\ell_0, r_0), \nu_0), \sigma_{\operatorname{\mathsf{Min}}}, \sigma_{\operatorname{\mathsf{Max}}}))$ . By 1233 construction,  $\rho^+$  does not reach a stopped leaf in  $\mathcal{T}^+(\mathcal{G})$ . If the play  $\rho^+$  stays in the 1234 common prefix tree of T and T<sup>+</sup>, then  $\rho = \rho^+$ , and  $\mathsf{wt}_{\mathcal{T}^+(\mathcal{G})}(\rho^+) \leq \mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) + \eta$ . 1235 If it doesn't, then  $\rho^+$  has a prefix that reaches a stopped leaf in  $\mathcal{T}(\mathcal{G})$ : this must be  $\rho$ . This 1236 implies that  $\operatorname{wt}_{\mathcal{T}^+(\mathcal{G})}(\rho^+) < -|\mathcal{R}(\mathcal{G})| w_{\max}^e - \sup |\operatorname{wt}_T| \leq \operatorname{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$  (see Lemma 20). 1237 Since this holds for all  $\eta > 0$ , we proved  $\mathsf{Val}_{\mathcal{T}^+(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0) \leq \mathsf{Val}_{\mathcal{T}(\mathcal{G})}((\tilde{\ell}_0, r_0), \nu_0)$ , which 1238 finally implies that the two values are equal. 1239

Then, we can follow the proof of Lemma 25 (with  $T^+$  and  $\mathcal{T}^+(\mathcal{G})$ ) in order to conclude.

Now, if we are given an almost-divergent game  $\mathcal{G}$  and a precision  $\varepsilon$ , we can glue together the semi-unfoldings of each SCC (non-positive SCCs have to get the same treatment as in Lemma 26 and get slightly more unfolded than the non-negative ones), and follow once again the proof of Lemma 25 in order to conclude. Therefore, by adding the convergence time of value iteration obtained from each SCC, we can obtain an integer P such that for all  $k \ge P$ , Val $_{\mathcal{G}}^{k}$  is an  $\varepsilon$ -approximation of Val $_{\mathcal{G}}$ .