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# ▶ To cite this version:

Paulin Jacobé de Naurois. Pointers in Recursion: Exploring the Tropics. 2019. hal-01934791v2

# HAL Id: hal-01934791 https://hal.science/hal-01934791v2

Preprint submitted on 4 Feb 2019 (v2), last revised 16 Dec 2019 (v3)

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# Pointers in Recursion: Exploring the Tropics

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Abstract. We translate the usual class of partial/primitive recursive functions to a pointer recursion framework, accessing actual input values via a pointer reading unit-cost function. These pointer recursive functions classes are proven equivalent to the usual partial/primitive recursive functions. Complexity-wise, this framework captures in a streamlined way most of the relevant sub-polynomial classes. Pointer recursion with the safe/normal tiering discipline of Bellantoni and Cook corresponds to polylogtime computation. We introduce a new, 10 non-size increasing tiering discipline, called tropical tiering. Tropical tiering and pointer 11 recursion, used with some of the most common recursion schemes, capture the classes logspace, 12 logspace/polylogtime, ptime, and NC. Finally, in a fashion reminiscent of the safe recursive 13 functions, tropical tiering is expressed directly in the syntax of the function algebras, yielding 14 15 the tropical recursive function algebras.

### 16 Introduction

Characterizing complexity classes without explicit reference to the computational model 17 used for defining these classes, and without explicit bounds on the resources allowed for the 18 calculus, has been a long term goal of several lines of research in computer science. One 19 rather successful such line of research is recursion theory. The foundational work here is the 20 result of Cobham [7], who gave a characterization of polynomial time computable functions 21 in terms of bounded recursion on notations - where, however, an explicit polynomial bound 22 is used in the recursion scheme. Later on, Leivant [11] refined this approach with the notion 23 of tiered recursion: explicit bounds are no longer needed in his recursion schemes. Instead, 24 function arguments are annotated with a static, numeric denotation, a *tier*, and a tiering 25 discipline is imposed upon the recursion scheme to enforce a polynomial time computation 26 bound. A third important step in this line of research is the work of Bellantoni and Cook [2], 27 whose safe recursion scheme uses only syntactical constraints akin to the use of only two tier 28 values, to characterize, again, the class of polynomial time functions. 29

Cobham's approach has also later on been fruitfully extended to other, important com-30 plexity classes. Results relevant to our present work, using explicitly bounded recursion, are 31 those of Lind [15] for logarithmic space, and Allen [1] and Clote [6] for small parallel classes. 32 Later on, Bellantoni and Cook's purely syntactical approach proved also useful for 33 characterizing other complexity classes. Leivant and Marion [14, 13] used a predicative 34 version of the safe recursion scheme to characterize alternating complexity classes, while 35 Bloch [3], Bonfante et al [4] and Kuroda[10], gave characterizations of small, polylogtime, 36 parallel complexity classes. An important feature of these results is that they use, either 37 explicitly or not, a tree-recursion on the input. This tree-recursion is implicitly obtained 38 in Bloch's work by the use of an extended set of basic functions, allowing for a dichotomy 39 recursion on the input string, while it is made explicit in the recursion scheme in the two 40 latter works. As a consequence, these characterizations all rely on the use of non-trivial basic 41 functions, and non-trivial data structures. Moreover, the use of distinct basic function sets 42 and data structures make it harder to express these charcterizations in a uniform framework. 43 Among all these previous works on sub-polynomial complexity classes, an identification is assumed between the argument of the functions of the algebra, on one hand, and the 45 computation input on the other hand: an alternating, logspace computation on input  $\overline{x}$ is denoted by a recursive function with argument  $\overline{x}$ . While this seems very natural for 47 complexity classes above linear time, it actually yields a fair amount of technical subtleties 48

and difficulties for sub-linear complexity classes. Indeed, following Chandra et al. [5] seminal 49 paper, sub-polynomial complexity classes need to be defined with a proper, subtler model 50 than the one-tape Turing machine: the random access Turing machine (RATM), where 51 computation input is accessed via a unit-cost pointer reading instruction. RATM input is 52 thus accessed via a read-only instruction, and left untouched during the computation - a 53 feature quite different to that of a recursive function argument. Our proposal here is to use 54 a similar construct for reading the input in the setting of recursive functions: our functions 55 will take as input pointers on the computation input, and one-bit pointer reading will be 56 assumed to have unit cost. Actual computation input are thus implicit in our function 57 algebras: the fuel of the computational machinery is only pointer arithmetics. This proposal 58 takes inspiration partially from the Rational Bitwise Equations of [4]. 59

Following this basic idea, we then introduce a new tiering discipline, called *tropical* 60 tiering, to enforce a non-size increasing behavior on our recursive functions, with some 61 inspirations taken from previous works of M. Hofmann [8, 9]. Tropical tiering induces a 62 polynomial interpretation in the tropical ring of polynomials (hence its name), and yields 63 a characterization of logarithmic space. The use of different, classical recursion schemes 64 yield characterizations of other, sub-polynomial complexity classes such as polylogtime, NC, 65 and the full polynomial time class. Following the approach of Bellantoni and Cook, we 66 furthermore embed the tiering discipline directly in the syntax, with only finitely many 67 different tier values - four tier values in our case, instead of only two tier values for the 68 safe recursive functions, and provide purely syntactical characterizations of these complexity 69 classes in a unified, simple framework. Compared to previous works, our framework uses a 70 unique, and rather minimal set of unit-cost basic functions, computing indeed basic tasks, 71 and a unique and also simple data structure. Furthermore, while the syntax of the tropical 72 composition and recursion schemes may appear overwhelming at first sight, it has the nice 73 feature, shared with the safe recursion functions of [2], of only adding a fine layer of syntactic 74 sugar over the usual composition and primitive recursion schemes. Removing this sugar 75 allows to retrieve the classical schemes. In that sense, we claim our approach to be simpler 76 and than the previous ones of [3, 4, 10]. 77

The paper is organized as follows. Section 1 introduces the notations, and the framework 78 of pointer recursion. Section 2 applies this framework to primitive recursion. Pointer 79 partial/primitive recursive functions are proven to coincide with their classical counterparts 80 in Theorem 2. Section 3 applies this framework to safe recursion on notations. Pointer 81 82 safe recursive functions are proven to coincide with polylogtime computable functions in Theorem 3. Tropical tiering is defined in Section 4. Proposition 4 establishes the tropical 83 interpretation induced by tropical tiering. Tropical recursive functions are then introduced in 84 Subsection 4.3. Section 5 gives a sub-algebra of the former, capturing logspace/polylogtime 85 computable functions in Theorem 9. Finally, Section 6 explores tropical recursion with 86 substitutions, and provides a characterization of P in Theorem 11 and of NC in Theorem 13. 87

# 88 1 Recursion

### <sup>89</sup> 1.1 Notations, and Recursion on Notations

Data structures considered in our paper are finite words over a finite alphabet. For the sake of simplicity, we consider the finite, boolean alphabet  $\{0, 1\}$ . The set of finite words over  $\{0, 1\}$  is denoted as  $\{0, 1\}^*$ .

Finite words over  $\{0, 1\}$  are denoted with overlined variables names, as in  $\overline{x}$ . Single values in  $\{0, 1\}$  are denoted as plain variables names, as in x. The empty word is denoted <sup>95</sup> by  $\varepsilon$ , while the dot symbol "." denotes the concatenation of two words as in  $a.\overline{x}$ , the finite <sup>96</sup> word obtained by adding an a in front of the word  $\overline{x}$ . Finally, finite arrays of boolean words <sup>97</sup> are denoted with bold variable names, as in  $\mathbf{x} = (\overline{x_1}, \dots, \overline{x_n})$ . When defining schemes, we <sup>98</sup> will often omit the length of the arrays at hand, when clear from context, and use bold <sup>99</sup> variable names to simplify notations. Similarly, for mutual recursion schemes, finite arrays of <sup>100</sup> mutually recursive functions are denoted by a single bold function name. In this case, the <sup>101</sup> width of this function name is the size of the array of the mutually recursive functions.

<sup>102</sup> Natural numbers are identified with finite words over  $\{0, 1\}$  via the usual binary encoding. <sup>103</sup> Yet, in most of our function algebras, recursion is not performed on the numerical value of an <sup>104</sup> integer, as in classical primitive recursion, but rather on its boolean encoding, that is, on the <sup>105</sup> finite word over  $\{0, 1\}$  identified with it: this approach is denoted as *recursion on notations*.

# **1.6 1.2 Turing Machines with Random Access**

<sup>107</sup> When considering sub-polynomial complexity class, classical Turing Machines often fail to <sup>108</sup> provide a suitable cost model. A crucial example is the class DLOGTIME: in logarithmic <sup>109</sup> time, a classical Turing machine fails to read any further than the first  $k \cdot \log(n)$  input bits. <sup>110</sup> In order to provide a suitable time complexity measure for sub-polynomial complexity classes, <sup>111</sup> Chandra et al [5] introduced the Turing Machine with Random Access (RATM), whose <sup>112</sup> definition follows.

#### **Definition 1.** RATM

A Turing Machine with Random Access (RATM) is a Turing machine with no input head, one (or several) working tapes and a special pointer tape, of logarithmic size, over a binary alphabet. The Machine has a special Read state such that, when the binary number on the pointer tape is k, the transition from the Read state consists in writing the k<sup>th</sup> input symbol on the (first) working tape.

# **119 1.3** Recursion on Pointers

In usual recursion theory, a function computes a value on its input, which is given explicitly as an argument. This, again, is the case in classical primitive recursion. While this is suitable for describing explicit computation on the input, as, for instance for single tape Turing Machines, this is not so for describing input-read-only computation models, as, for instance, RATMs. In order to propose a suitable recursion framework for input-read-only computation, we propose the following *pointer recursion* scheme, whose underlying idea is pretty similar to that of the RATM.

As above, recursion data is given by finite, binary words, and the usual recursion on notation techniques on these recursion data apply. The difference lies in the way the actual computation input is accessed: in our framework, we distinguish two notions, the *computation input*, and the *function input*: the former denotes the input of the RATM, while the latter denotes the input in the function algebra. For classical primitive recursive functions, the two coincide, up to the encoding of integer into binary strings. In our case, we assume an explicit encoding of the former into the latter, given by the two following constructs.

- Let  $\overline{w} = w_1 \cdots w_n \in \{0, 1\}^*$  be a computation input. To  $\overline{w}$ , we associate two constructs,
- the Offset: a finite word over  $\{0, 1\}$ , encoding in binary the length n of  $\overline{w}$ , and
- the Read construct, a 1-ary function, such that, for any binary encoding  $\overline{i}$  of an integer  $0 < i \le n$ , Read $(\overline{i}) = w_i$ , and, for any other value  $\overline{v}$ , Read $(\overline{v}) = \varepsilon$ .

Then, for a given *computation input*  $\overline{w}$ , we fix accordingly the semantics of the **Read** and 138 Offset constructs as above, and a *Pointer Recursive function* over  $\overline{w}$  is evaluated with sole 139 input the Offset, accessing computation input bits via the Read construct. For instance, 140 under these conventions, Read(hd(Offset)) outputs the first bit of the computational input 141  $\overline{w}$ . In some sense, the two constructs depend on  $\overline{w}$ , and can be understood as functions on  $\overline{w}$ . 142 However, in our approach, it is important to forbid  $\overline{w}$  from appearing explicitly as a function 143 argument in the syntax of the function algebras we will define, and from playing any role in 144 the composition and recursion schemes. Since  $\overline{w}$  plays no role at the syntactical level - its 145 only role is at the semantical level- we chose to remove it completely  $\overline{w}$  from the syntactical 146 definition of our functions algebras. 147

# **2 Pointers Primitive Recursion**

Let us first detail our pointer recursive framework for the classical case of primitive recursion
 on notations.

#### <sup>151</sup> 2.0.0.1 Basic pointer functions.

<sup>152</sup> Basic pointer functions are the following kind of functions:

1. Functions manipulating finite words over  $\{0, 1\}$ . For any  $a \in \{0, 1\}, \overline{x} \in \{0, 1\}^*$ ,

 $\begin{array}{rcl} \operatorname{hd}(a.\overline{x}) &=& a & \operatorname{tl}(a.\overline{x}) &=& \overline{x} & \operatorname{s}_0(\overline{x}) &=& 0.\overline{x} \\ \operatorname{hd}(\varepsilon) &=& \varepsilon & \operatorname{tl}(\varepsilon) &=& \varepsilon & \operatorname{s}_1(\overline{x}) &=& 1.\overline{x} \end{array}$ 

**2.** Projections. For any  $n \in \mathbb{N}$ ,  $1 \leq i \leq n$ ,

$$\Pr_i^n(\overline{x_1},\cdots,\overline{x_n})=\overline{x_i}$$

153 3. and, finally, the Offset and Read constructs, as defined above.

#### <sup>154</sup> 2.0.0.2 Composition.

Given functions g, and  $h_1, \dots, h_n$ , we define f by composition as

$$f(\mathbf{x}) = g(h_1(\mathbf{x}), \cdots, h_n(\mathbf{x})).$$

155

#### 156 2.0.0.3 Primitive Recursion on Notations.

Let  $\perp$  denote non-terminating computation. Given functions h,  $g_0$  and  $g_1$ , we define f by primitive recursion on notations as

159 
$$f(\varepsilon, \mathbf{y}) = h(\mathbf{y})$$

$$f(\mathbf{s}_{a}(\overline{x}), \mathbf{y}) = \begin{cases} g_{a}(\overline{x}, f(\overline{x}, \mathbf{y}), \mathbf{y}) & \text{if } f(\overline{x}, \mathbf{y}) \neq \bot \\ \bot & \text{otherwise.} \end{cases}$$

#### <sup>161</sup> 2.0.0.4 Minimization.

For a function s, denote by  $s^{(n)}$  its  $n^{th}$  iterate. Then, given a function h, we define f by minimization on  $\overline{x}$  as

$$\mu \overline{x}(h(\overline{x}, \mathbf{y})) = \begin{cases} \perp & \text{if } \forall t \in \mathbb{N}, \operatorname{hd}(h(s_0^{(t)}(\varepsilon), \mathbf{y})) \neq \mathbf{s}_1(\varepsilon) \\ s_0^{(k)}(\varepsilon) & \text{where } k = \min\{t : \operatorname{hd}(h(s_0^{(t)}(\varepsilon), \mathbf{y})) = \mathbf{s}_1(\varepsilon)\} & \text{otherwise.} \end{cases}$$

In other words, a function f defined by minimization on h produces the shortest sequence of 0 symbols satisfying a simple condition on h, if it exists.

Let now  $PR_{not}^{point}$  be the closure of basic pointer functions under composition and primitive recursion on notations, and  $REC_{not}^{point}$  be the closure of basic pointer functions under composition, primitive recursion on notations, and minimization. Then, as expected,

**Theorem 2.** Modulo the binary encoding of natural integers,  $PR_{not}^{point}$  is the classical class of primitive recursive functions, and  $REC_{not}^{point}$  is the classical class of recursive functions.

PROOF. It is already well known that primitive recursive functions on notations are the classical primitive recursive functions, and recursive functions on notations are the classical recursive functions. Now, for one direction, it suffices to express the Read and Offset basic pointer functions as primitive recursive functions on the computation input. For the other direction, it suffices to reconstruct with pointer primitive recursion the computation input from the Read and Offset basic pointer functions.

# <sup>175</sup> **3** Pointer Safe Recursion

We recall the tiering discipline of Bellantoni and Cook [2]: functions arguments are divided into two tiers, *normal* arguments and *safe* arguments. Notation-wise, both tiers are separated by a semicolon symbol in a block of arguments, the normal arguments being on the left, and the safe arguments on the right. We simply apply this tiering discipline to our pointer recursion framework.

### **3.0.0.1** Basic Pointer Safe Functions.

Basic pointer safe functions are the basic pointer functions of the previous section, all their
arguments being considered safe.

#### 184 3.0.0.2 Safe Composition.

Safe composition is somewhat similar to the previous composition scheme, with a tiering discipline, ensuring that safe arguments cannot be moved to a normal position in a function call. The reverse however is allowed.

$$f(\mathbf{x};\mathbf{y}) = g(h_1(\mathbf{x};),\cdots,h_m(\mathbf{x};);h_{m+1}(\mathbf{x};\mathbf{y}),\cdots,h_{m+n}(\mathbf{x};\mathbf{y})).$$

Calls to functions  $h_{m+i}$ , where safe arguments are used, are placed in safe position in the argument block of g. A special case of safe composition is  $f(\overline{x}; \overline{y}) = g(; \overline{x}, \overline{y})$ , where a normal argument  $\overline{x}$  is used in safe position in a call. Hence, we liberally use normal arguments in safe position, when necessary.

#### 3.0.0.3 Safe Recursion. 189

The recursion argument is normal. The recursive call is placed in safe position, a feature 190 that prevents nesting recursive calls exponentially. 191

192 
$$f(\varepsilon, \mathbf{y}; \mathbf{z}) = h(\mathbf{y}; \mathbf{z})$$

 $f(a.\overline{x}, \mathbf{y}; \mathbf{z}) = g_a(\overline{x}, \mathbf{y}; f(\overline{x}, \mathbf{y}; \mathbf{z}), \mathbf{z}).$ 193

Let now  $SR_{not}^{point}$  be the closure of the basic pointer safe functions under safe composition 194 and safe recursion. 195

**•** Theorem 3.  $SR_{not}^{point}$  is the class DTIME(polylog) of functions computable in poly-196 logarithmic time. 197

The proof is essentially the same as for the classical result by Bellantoni and Proof. 198 Cook [2]. Here however, it is crucial to use the RATM as computation model. Simulating a 199 polylogtime RATM with safe recursion on pointers is very similar to simulating a polytime 200 TM with safe recursion - instead of explicitly using the machine input as recursion data, 201 we use the size of the input as recursion data, and access the input values via the Read 202 construct, exactly as is done by the RATM model. The other direction is also similar: the 203 tiering discipline of the safe recursion on pointers enforces a polylog bound on the size of the 204 strings (since the initial recursion data - the Offset - has size logarithmic in the size n of 205 the computation input), and thus a polylog bound on the computation time. 206

#### 4 **Tropical Tiering** 207

We present here another, stricter tiering discipline, that we call tropical Tiering. The adjective 208 "tropical" refers to the fact that this tiering induces a polynomial interpretation in the tropical 209 ring of polynomials. This tiering discipline takes some inspiration from Hofmann's work on 210 non-size increasing types [8], and pure pointer programs [9]. The idea however is to use here 211 different tools than Hofmann's to achieve a similar goal of bounding the size of the function 212 outputs. We provide here a non-size increasing discipline via the use of tiering, and use it in 213 the setting of pointer recursion to capture not only pure pointer programs (Hoffman's class), 214 but rather pointer programs with pointer arithmetics, which is in essence the whole class 215 Logspace. 216

#### 4.0.0.1 **Basic Pointer Functions.** 217

We add the following numerical successor basic function. Denote by  $E: \mathbb{N} \to \{0, 1\}^*$  the usual binary encoding of integers, and  $D: \{0,1\}^* \to \mathbb{N}$  the decoding of binary strings to integers. Then,

$$\mathbf{s}(\overline{x}) = E(D(\overline{x}) + 1)$$

denotes the numerical successor on binary encodings, and, by convention,  $\varepsilon$  is the binary 218 encoding of the integer 0. 219

#### 4.0.0.2 Primitive Recursion on Values. 220

Primitive recursion on values is the usual primitive recursion, encoded into binary strings: 221

$$f(\varepsilon, \mathbf{y}) = h(\mathbf{y})$$

 $\begin{array}{lll} f(\varepsilon,\mathbf{y}) &=& h(\mathbf{y}) \\ f(\mathbf{s}(\overline{x}),\mathbf{y}) &=& g(\overline{x},f(\overline{x},\mathbf{y}),\mathbf{y}). \end{array}$ 223

224

# 225 4.1 Tropical Tier

As usual, tiering consists in assigning function variables to different classes, called tiers. In our setting, these tiers are identified by a numerical value, called *tropical tier*, or, shortly, *tropic*. The purpose of our tropical tiers is to enforce a strict control on the increase of the size of the binary strings during computation. Tropics take values in  $\mathbb{Z} \cup \{-\infty\}$ . The tropic of the *i*<sup>th</sup> variable of a function *f* is denoted  $T_i(f)$ . The intended meaning of the tropics is to provide an upper bound on the linear growth of the function output size with respect to the corresponding input size, as per Proposition 4. Tropics are inductively defined as follows.

1. Basic pointer functions:

$$\begin{array}{rcl} T_{j \neq i}(\mathtt{Pr}_i^n) &=& -\infty & T_1(\mathtt{hd}) &=& -\infty & T_1(\mathtt{Read}) &=& -\infty \\ T_1(\mathtt{tl}) &=& -1 & & \\ T_i(\mathtt{Pr}_i^n) &=& 0 & & \\ T_1(\mathtt{s}_0) &=& 1 & & T_1(\mathtt{s}_1) &=& 1 & & T_1(\mathtt{s}) &=& 1 \end{array}$$

2. Composition:

$$T_t(f) = \max\{T_i(g) + T_t(h_i)\}.$$

233 **3.** Primitive recursion on notations. Two cases arise:

 $T_2(g_0) \leq 0$  and  $T_2(g_1) \leq 0$ . In that case, we set 234 **a.**  $T_1(f) = \max \{T_1(g_0), T_1(g_1), T_2(g_0), T_2(g_1)\}, \text{ and}$ 235 **b.** for all t > 1, 236  $T_t(f) = \max\{T_{t+1}(g_0), T_{t+1}(g_1), T_{t-1}(h), T_2(g_0), T_2(g_1)\}.$ 237 - the previous case above does not hold,  $T_2(g_0) \leq 1$ , and  $T_2(g_1) \leq 1$ . In that case, 238 we also require that  $T_1(g_0) \leq 0$ ,  $T_1(g_1) \leq 0$ , and, for all  $t \geq 2$ ,  $T_t(g_0) = T_t(g_1) =$ 239  $T_{t-2}(h) = -\infty$ . Then, we set  $T_1(f) = \max\{T_1(g_0), T_1(g_1), T_2(g_0) - 1, T_2(g_1) - 1, c_h\},\$ 240 where  $c_h$  is a constant for h given in Proposition 4 below, and, for  $t \ge 1$ ,  $T_t(f) = -\infty$ . 241 Other cases than the two above do not enjoy tropical tiering. 242 4. Primitive recursion on values. Only one case arises: 243

 $T_2(g) \leq 0$ . In that case, we set

- a.  $T_1(f) = \max \{T_1(g), T_2(g)\}, \text{ and},$
- **b.** for all  $t \ge 1$ ,  $T_t(f) = \max\{T_{t+1}(g), T_{t-1}(h), T_2(g)\}$ .
- Again, other cases than the one above do not enjoy tropical tiering.

Furthermore, when using tropical tiering, we use mutual recursion schemes. For  $\mathbf{f} = (f_1, \dots, f_n)$ , mutual primitive recursion (on values) is classically defined as follows,

and similarly for mutual primitive recursion on notations. Tropical tiering is then extended
 to mutual primitive recursion in a straightforward manner.

We define the set of L-primitive pointer recursive functions as the closure of the basic pointer functions of Sections 2 and 4 under composition, (mutual) primitive recursion on notations and (mutual) primitive recursion on values, with tropical tiering.

# 257 4.2 Tropical Interpretation

- <sup>258</sup> Tropical tiering induces a non-size increasing discipline. More formally,
- **Proposition 4.** The tropical tiering of a L-primitive recursive function f induces a polynomial interpretation of f on the tropical ring of polynomials, as follows.
  - For any L-primitve recursive function f with n arguments, there exists a constant  $c_f \geq 0$  such that

$$|f(\overline{x_1},\cdots,\overline{x_n})| \le \max\{T_t(f)+|\overline{x_t}|,c_f\}.$$

- PROOF. The proof is given for non-mutual recursion schemes, by induction on the
   definition tree. Mutual recursion schemes follow the same pattern.
- <sup>263</sup> 1. For basic pointer functions, the result holds immediately.
- 264 2. Let f be defined by composition, and assume that the result holds for the functions g,
- $h_1, \dots, h_n$ . Then, for any  $i = 1, \dots, n$ ,  $|h_i(\mathbf{x})| \leq \max_t \{T_t(h_i) + |\overline{x_t}|, c_{h_i}\}$ . Moreover,
- there exists by induction  $c_g$  such that  $|g(h_1(\mathbf{x}), \cdots, h_n(\mathbf{x}))| \le \max_i \{T_i(g) + |h_i(\mathbf{x})|, c_g\}.$
- Composing the inequalities above yields  $|g(h_1(\mathbf{x}), \cdots, h_n(\mathbf{x}))| \le \max_i \{T_i(g) + \max_t \{T_t(h_i) + |\overline{x_i}|, c_{h_i}\}, c_g\} = \max_t \{T_t(f) + |\overline{x_t}|, \max_i \{c_{f_i}, c_g\}\}.$
- **3.** Let f be defined by primitive recursion on notations, and assume that the first case holds. Let  $f(a.\overline{x}, \mathbf{y}) = g_a(\overline{x}, f(\overline{x}, \mathbf{y}), \mathbf{y})$ , for  $a \in \{0, 1\}$ , and assume  $T_2(g_0) \leq 0$  and  $T_2(g_1) \leq 0$ . We apply the tropical interpretation on g, and we show by induction the result for f on the length of  $a.\overline{x}$ .
- a. If  $\max_{\overline{x}, f(\overline{x}, \mathbf{y}), t}\{|\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_{t+2}(g_a), c_{g_a}\} = |\overline{x}| + T_1(g_a)$ :  $|f(a.\overline{x}, \mathbf{y})| \leq |\overline{x}| + T_1(g_a) \leq |\overline{x}| + T_1(f)$ , and the result holds.
- b. If  $\max_{\overline{x}, f(\overline{x}, \mathbf{y}), t}\{|\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_{t+2}(g_a), c_{g_a}\} = |f(\overline{x}, \mathbf{y})| + T_2(g_a)$ : Since  $T_2(g_a) \leq 0, |f(a.\overline{x}, \mathbf{y})| \leq |f(\overline{x}, \mathbf{y})|$ , and the induction hypothesis applies.
- c. If  $\max_{\overline{x}, f(\overline{x}, \mathbf{y}), t} \{ |\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_{t+2}(g_a), c_{g_a} \} = |\overline{y_t}| + T_{t+2}(g_a)$ for some t: the result applies immediately by structural induction on  $g_a$ .
  - d. If  $\max_{\overline{x}, f(\overline{x}, \mathbf{y}), t} \{ |\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_{t+2}(g_a), c_{g_a} \} = c_{g_a}$ , the result holds immediately.
- e. The base case  $f(\epsilon, \mathbf{y})$  is immediate.

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- 4. Let f be defined by primitive recursion on notations, and assume now that the second of the two corresponding cases holds. Let  $f(a.\overline{x}, \mathbf{y}) = g_a(\overline{x}, f(\overline{x}, \mathbf{y}), \mathbf{y})$ , for  $a \in \{0, 1\}$ . Since the first case does not hold,  $T_2(g_0) = 1$  or  $T_2(g_1) = 1$ : assume that  $T_2(g_0) = 1$ (the other case being symmetric). Assume also that,  $T_1(g_0) \leq 0$  and  $T_1(g_1) \leq 0$ , and for all  $t \geq 2$ ,  $T_t(g_0) = T_t(g_1) = T_{t-2}(h) = -\infty$ . Then, we set  $T_1(f) = \max\{0, c_h\}$ . We apply the tropical interpretation on g, and prove by induction on the length of  $a.\overline{x}$  that  $|f(a.\overline{x}, \mathbf{y})| \leq |a.\overline{x}| + \max\{c_{g_1}, c_{g_2}, c_h\}$ .
- a. If  $\max_{t\geq 2}\{|\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_t(g_a), c_{g_a}\} = |\overline{x}| + T_1(g_a)$ . Since  $T_1(g_a) \leq 0$  and  $T_1(f) \geq 0, |f(a.\overline{x}, \mathbf{y})| \leq |\overline{x}| \leq T_1(f) + |\overline{x}|$ , and the result holds.
- b. If  $\max_{t\geq 2}\{|\overline{x}|+T_1(g_a), |f(\overline{x}, \mathbf{y})|+T_2(g_a), |\overline{y_t}|+T_t(g_a), c_{g_a}\} = |f(\overline{x})|+T_2(g_a)$ . Since  $T_2(g_a) \leq 1, |f(a.\overline{x})| \leq 1 + |f(\overline{x})|$ , and the induction hypothesis allows to conclude.
- c. If  $\max_{t\geq 2}\{|\overline{x}| + T_1(g_a), |f(\overline{x}, \mathbf{y})| + T_2(g_a), |\overline{y_t}| + T_t(g_a), c_{g_a}\} = c_{g_a}$ , the result holds immediately.
- d. The case  $\max_{t\geq 2}\{|\overline{x}|+T_1(g_a), |f(\overline{x},\mathbf{y})|+T_2(g_a), |\overline{y_t}|+T_t(g_a), c_{g_a}\} = |\overline{y_t}|+T_t(g_a)$  is impossible since  $T_t(g_a) = -\infty$  for  $t\geq 2$ .
- e. The base case  $f(\epsilon, \mathbf{y})$  is immediate.
- 5. Let now assume f is define by primitive recursion on values. Then, the only possible case is similar to the first case of primitive recursion on notation.

The proof by induction above emphasizes the critical difference between recursion on notation and recursion on values: the second case of the safe recursion on notations correspond to the linear, non-size increasing scanning of the input, as in, for instance,

$$f(a.\overline{x}) = s_a(f(\overline{x})).$$

This, of course, is only possible in recursion on notation, where the height of the recursive calls stack is precisely the length of the scanned input. Recursion on values fails to perform this linear scanning, since, for a given recursive argument  $\overline{x}$ , the number of recursive calls is then exponential in  $|\overline{x}|$ .

Proposition 4 proves that the tropical tiering of a function yields actually a tropical polynomial interpretation for the function symbols: The right hand side of the Lemma inequality is indeed a tropical interpretation. Moreover, this interpretation is directly given by the syntax.

Furthermore, the proof also highlights why we use mutual recursion schemes instead of more simple, non-mutual ones: non-size increasing discipline forbids the use of multiplicative constants in the size of the strings. So, in order to capture a computational space of size  $k \cdot \log(n)$ , we need to use k binary strings of length  $\log(n)$ , defined by mutual recursion.

**Solution Solution Solution**

313 PROOF.

Proposition 4 ensures that the size of all binary strings is logarithmically bounded. 314 A structural induction on the definition of f yields the result. The only critical case is 315 that of a recursive construct. When evaluating a recursive construct, one needs simply 316 to store all non-recursive arguments (the  $\overline{y_i}$ 's) in a shared memory, keep a shared counter 317 for keeping track of the recursive argument  $\overline{x}$ , and use a simple while loop to compute 318 successively all intermediate recursive calls leading to  $f(\overline{x}, \mathbf{y})$ . All these shared values have 319 logarithmic size. The induction hypothesis ensures then that, at each step in the while 320 loop, all computations take logarithmic space. The two other cases, composition and basic 321 functions, are straightforward. 322

In the following section, we prove the converse: logarithmic space functions can be computed by a sub-algebra of the L-primitive pointer recursive functions.

# 325 4.3 Tropical Recursion

In this section we restrict our tropical tiering approach to only four possible tier values: 1, 0, -1 and  $-\infty$ . While doing so, we still retrain the same expressiveness. The rules for tiering are adapted accordingly. More importantly, the use of only four tier values allows us to denote these tropics directly in the syntax, in an approach similar to that of Bellantoni and Cook, by adding purely syntactical features to the composition and primitive recursion schemes. Let us take as separator symbol the following  $\geq$  symbol, with leftmost variables having the highest tier. As with safe recursive functions, we allow the use of a high tier variable in a low tier position, as in, for instance,

$$f(\overline{x} \wr \overline{y} \wr \overline{z} \wr \overline{t}) = g(\wr \overline{y} \wr \overline{x}, \overline{z} \wr \overline{t}).$$

<sup>326</sup> Our tropical recursive functions are then as follows.

#### 4.3.0.1 Basic tropical pointer functions. 327

Basic tropical pointer functions are the following.

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#### 4.3.0.2 Tropical composition. 329

Define  $\mathbf{t} = \mathbf{t}_1, \mathbf{t}_2, \mathbf{t}_3, \mathbf{t}_4$ . The tropical composition scheme is then 330

$$\begin{array}{rcl} {}_{331} & f(\mathbf{x} \wr \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) &= g(h_1(\wr \mathbf{x} \wr \mathbf{y} \wr \mathbf{t}), \cdots, h_a(\wr \mathbf{x} \wr \mathbf{y} \wr \mathbf{t}) \wr \\ {}_{332} & h_{a+1}(\mathbf{x} \wr \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \cdots, h_b(\mathbf{x} \wr \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) \wr \\ {}_{333} & h_{b+1}(\mathbf{y} \wr \mathbf{z} \wr \iota \mathbf{t}), \cdots, h_c(\mathbf{y} \wr \mathbf{z} \wr \iota \mathbf{t}) \wr \\ {}_{334} & h_{c+1}(\mathbf{t}_1 \wr \mathbf{t}_2 \wr \mathbf{t}_3 \wr \mathbf{t}_4), \cdots, h_d(\mathbf{t}_1 \wr \mathbf{t}_2 \wr \mathbf{t}_3 \wr \mathbf{t}_4)) \end{array}$$

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4.3.0.3 Tropical Recursion on Notations - case 1. 337

 $\mathbf{f}(\mathbf{x} \wr \varepsilon, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) = \mathbf{h}(\mathbf{x} \wr \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ 338  $\mathbf{f}(\mathbf{x} \wr \mathbf{s}_a(\overline{r} \wr \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) = \mathbf{g}_a(\mathbf{x} \wr \overline{r}, \mathbf{f}(\mathbf{x} \wr \overline{r}, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ 339 340

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#### 4.3.0.4 Tropical Recursion on Notations - case 2. (Linear scanning) 342

 $\mathbf{f}(\wr \varepsilon \wr \wr \mathbf{t}) = \varepsilon$ 343  $\mathbf{f}(\mathbf{i} \mathbf{s}_a(\overline{r} \mathbf{i} \mathbf{i} \mathbf{i}) \mathbf{i} \mathbf{i}) = \mathbf{g}_a(\mathbf{f}(\mathbf{i} \overline{r} \mathbf{i} \mathbf{i}) \mathbf{i} \overline{r} \mathbf{i} \mathbf{i})$ 344

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#### 4.3.0.5 Tropical Recursion on Values. 346

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 $\mathbf{f}(\mathbf{x} \wr \varepsilon, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) = \mathbf{h}(\mathbf{x} \wr \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$  $\mathbf{f}(\mathbf{x} \wr \mathbf{s}(\overline{r} \wr \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) = \mathbf{g}(\mathbf{x} \wr \overline{r}, \mathbf{f}(\mathbf{x} \wr \overline{r}, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ 348

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As above, we use the mutual version of these recursion schemes, with the same tiering 351 discipline. Note that, unlike previous characterizations of sub-polynomial complexity classes [3, 352 4, 10], our tropical composition and recursion schemes are only syntactical refinements of the 353 usual composition and primitive recursion schemes - removing the syntactical sugar yields 354 indeed the classical schemes. 355

**Definition 6.** *L*-tropical functions

<sup>357</sup> The class of L-tropical functions is the closure of our basic tropical pointer functions, under

tropical composition, tropical mutual recursion on notations, and tropical mutual recursion on values.

The restriction of only four tier values suffices to capture the computational power of RATMs. More precisely,

Theorem 7. The class of L-tropical functions is the class of functions computable in
 logarithmic space, with logarithmic size output.

<sup>364</sup> PROOF. L-tropical functions are L- primitive pointer recursive functions with tropics 1, 0, <sup>365</sup> -1 and  $-\infty$ . Following Corollary 5, they are computable in logspace. The converse follows <sup>366</sup> from the simulation of a logarithmic space RATM, given in the Appendix. The simulation <sup>367</sup> works as follows.

#### **4.3.0.6** Encoding the machine configurations.

Assume the machine M works in space  $k \lceil \log(n+1) \rceil$ . A configuration of M is then encoded by 2k+3 binary strings of length less than  $\lceil \log(n+1) \rceil$ :

- <sup>371</sup> 1. one string, of constant length, encodes the machine state,
- **2.** one string, of length  $\lceil \log(n+1) \rceil$ , encodes the pointer tape,
- 373 **3.** one string, of length  $\lceil \log(n+1) \rceil$ , encodes the head of the pointer tape. It contains **0** 374 symbols everywhere, but on the position of the head (where it contains a **1**).
- 4. k strings, of length  $\lceil \log(n+1) \rceil$ , encode the content of the work tape, and
- **5.** k strings, of length  $\lceil \log(n+1) \rceil$ , encode the position of the work tape head, with (as for
- the pointer tape) **0** everywhere but on the position of the head.

#### **4.3.0.7** Reading and Updating a configuration.

- Linear scanning of the recursive argument in tropical recursion, corresponding to case 2 of the definition of tropical recursion on notations, is used to read and to update the encoding
- <sup>381</sup> of the configuration. In order to do so, one defines L-tropical functions for
- encoding boolean values true and false, boolean connectives, and if then else constructs,
- scanning an input string until a 1 is found, and computing the corresponding prefix
   sequence,
- 386 3. computing left and right extractions of sub-strings of a string, for a given prefix,
- replacing exactly one bit in a binary string, whose position is given by a prefix of the
   string.

These functions are given in the Appendix. With all these simple bricks, and especially with the in-place one-bit replacement, one is then able to read a configuration, and to update it,

<sup>390</sup> the in-place one-bit replacement, one is then able to read a configuration, and to updat <sup>391</sup> with L-tropical functions. None of these L-tropical functions uses recursion on values.

#### <sup>392</sup> 4.3.0.8 Computing the Transition map of the Machine.

- <sup>393</sup> Given the functions above, the transition map **Next** of the machine is then computed by a
- simple L-tropical function of width (2k+3): For a recursive argument  $\overline{s}$  of size  $\lceil \log(n+1) \rceil$ ,
- Next $( \langle \overline{s}, \mathbf{c} \rangle \rangle$  computes the configuration reached from  $\mathbf{c}$  in one transition step.

#### <sup>396</sup> 4.3.0.9 Simulating the RATM.

The simulation of the RATM is then obtained by iterating its transition map a suitable number of times. The time upper bound is here obtained by nesting k tropical recursive functions on values: on an input of size  $\lceil \log(n+1) \rceil$ , the unfolding of these recursive calls takes time  $n^k$ . At each recursive step, this function needs to apply the transition map. The transition map having width (2k+3), we use here a mutual recursion scheme, of width (2k+3). Again, for a recursive argument  $\overline{s}$  of size  $\lceil \log(n+1) \rceil$ , we define

Replacing  $\overline{s}$  by the **Offset** in the above gives the correct bounds. Finally, one simply needs to use simple L-tropical functions for computing the initial configuration, and reading the final configuration.

# **5** Logarithmic Space, Polylogarithmic Time

### **414** ► **Definition 8.** *LP-tropical functions*

<sup>415</sup> The class of LP-tropical functions is the closure of our basic tropical pointer functions, under <sup>416</sup> tropical composition and tropical mutual recursion on notations.

▶ Theorem 9. The class of LP-tropical functions is the class of functions computable in
 logarithmic space, polylogarithmic time, with logarithmic size output.

PROOF. Mutual recursion on notations, with recursive arguments of logarithmic size, are
computable in polylogarithmic time, following similar arguments as in the proof of Theorem 7.
The converse follows from the simulation in the proof of Theorem 7 above, where mutual
recursion on values for the functions Step<sub>i</sub> is replaced by mutual recursion on notations.

### 423 **6** Alternation

In this section we extend the approach of Leivant and Marion [12] to our setting. Let us
define a similar tropical recursion on notations with substitutions. Note that the tropical
tiering discipline prevents using substitutions in case 2 of the tropical recursion on notations.
Substitutions are therefore only defined for case 1 of this recursion scheme.

### **6.0.0.1** Tropical Recursion with substitutions on Notations.

Given functions  $h, g_0, g_1, k_1$  and  $k_2$ ,

$$\begin{array}{lll} \mathbf{f}(\mathbf{x}\wr\varepsilon,\overline{u},\mathbf{y}\wr\mathbf{z}\wr\mathbf{t}) &=& \mathbf{h}(\mathbf{x}\wr\overline{u},\mathbf{y}\wr\mathbf{z}\wr\mathbf{t}) \\ \mathbf{f}(\mathbf{x}\wr\mathbf{s}_{a}(\overline{r}\wr\wr\wr),\mathbf{y}\wr\overline{u},\mathbf{z}\wr\mathbf{t}) &=& \mathbf{g}_{a}(\mathbf{x}\wr\overline{r},\mathbf{f}(\mathbf{x}\wr\overline{r},k_{1}(\wr\overline{u}\wr\wr),\mathbf{y}\wr\mathbf{z}\wr\mathbf{t}), \\ &\quad \mathbf{f}(\mathbf{x}\wr\overline{r},k_{2}(\wr\overline{u}\wr\iota),\mathbf{y}\wr\mathbf{z}\iota\mathbf{t}),\mathbf{y}\wr\mathbf{z}\wr\mathbf{t}) \end{array}$$

### 429 6.0.0.2 Tropical Recursion with substitutions on Values.

Given functions  $h, g, k_1$  and  $k_2$ ,

$$\begin{array}{rcl} \mathbf{f}(\mathbf{x} \wr \varepsilon, \overline{u}, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) &=& \mathbf{h}(\mathbf{x} \wr \overline{u}, \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) \\ \mathbf{f}(\mathbf{x} \wr \mathbf{s}(\overline{r} \wr \wr \wr), \mathbf{y} \wr \overline{u}, \mathbf{z} \wr \mathbf{t}) &=& \mathbf{g}(\mathbf{x} \wr \overline{r}, f(\mathbf{x} \wr \overline{r}, k_1(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \\ & & \mathbf{f}(\mathbf{x} \wr \overline{r}, k_2(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) . \end{array}$$

430 Again, as above, we assume these recursion schemes to be mutual.

431 ► Definition 10. *P*-tropical functions

432 The class of P-tropical functions is the closure of our basic tropical pointer functions, under

tropical composition, tropical recursion on notations and on values, and tropical recursion
with substitutions on notations and on values.

▶ **Theorem 11.** The class of P-tropical functions with binary output is the class P.

<sup>436</sup> PROOF. The result follows from Alogspace = P [5], and Theorem 7. Substitutions in <sup>437</sup> the tropical recursion scheme on notations amounts to alternation. Restriction to decision <sup>438</sup> classes instead of function classes comes from the use of alternating Turing machines, which <sup>439</sup> compute only decision problems.

Let us first see how to simulate a logspace alternating machine with P-tropical functions. Recall the notations and functions of the proof of Theorem 7. Since we now need to simulate a non-deterministic, alternating machine, we assume without loss of generality that we now have two kinds of machine states:

- 444 non-deterministic universal
- 445 🔲 non-deterministic existential

and that non-deterministic transitions have at most two branches. Therefore, we also assume that we have one predicate that determines the kind of a state in a configuration c: IsUniversal( $\langle \bar{s}, c \rangle \langle \rangle$ ). This predicate is assumed to output false or true.

We also assume that we have two transition maps,  $Next_0( \ \ \overline{s}, \mathbf{c} \ \ \ )$ , and  $Next_1( \ \ \overline{s}, \mathbf{c} \ \ )$ , for computing both branches of non-deterministic transitions. For deterministic transitions, we assume both branches are the same. Finally, we also assume we have a predicate isPositive( $\ \ \overline{s}, \mathbf{c} \ \ \ )$ , which returns true if the configuration  $\mathbf{c}$  is final and accepting, and false otherwise.

We define now, with substitutions, the following:

<sup>454</sup> Then, for  $\overline{t}$  and  $\overline{s}$  large enough, and an initial configuration **c**, Accept( $\langle \overline{t}, \overline{s}, \mathbf{c} \rangle \rangle$ ) outputs

the result of the computation of the machine. Finally, nesting up to k layers of such recursion on values schemes allows, as in the proof of Theorem 7, to simulate a polynomial computation time.

The other direction is pretty straightforward: For any instance of a recursion scheme with substitutions, for any given values  $\overline{r}$ ,  $\overline{u}$ ,  $\mathbf{x}$ ,  $\mathbf{y}$  and  $\mathbf{z}$ , each bit of

- $\mathbf{g}_{a}(\mathbf{x} \wr \overline{r}, \mathbf{f}(\mathbf{x} \wr \overline{r}, k_{1}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{f}(\mathbf{x} \wr \overline{r}, k_{2}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}) \text{ is a boolean func-}$
- tion of the bits of  $\mathbf{f}(\mathbf{x} \wr \overline{r}, k_1(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$  and  $\mathbf{f}(\mathbf{x} \wr \overline{r}, k_2(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ . Hence, it

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- 462 can be computed by an alternating procedure. The space bound follows from the bound on
- <sup>463</sup> the size of the strings, provided by the tiering discipline.

### **464** ► Definition 12. *NC-tropical functions*

- <sup>465</sup> The class of NC-tropical functions is the closure of our basic pointer tropical functions, under
- tropical composition, tropical recursion on notations and tropical recursion with substitutions on notations.
- **468** ► **Theorem 13.** The class of NC-tropical functions with binary output is NC.
- <sup>469</sup> PROOF. The result follows from A(logspace, polylogtime) = NC [16], and Theorem 7. <sup>470</sup> Substitutions in the tropical recursion scheme on notations amounts to alternation. The <sup>471</sup> proof is similar to that of Theorem 11, where additionally,
- <sup>472</sup> The time bound on the computation of the machine needs only to be polylogarithmic,
- instead of polynomial. As in Theorem 9, tropical recursion on notations suffices to obtain
  this bound, and tropical recursion on values is no longer needed.
- <sup>475</sup> For the other direction, any bit of
- 476  $\mathbf{g}_{a}(\mathbf{x} \wr \overline{r}, \mathbf{f}(\mathbf{x} \wr \overline{r}, k_{1}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{f}(\mathbf{x} \wr \overline{r}, k_{2}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t}), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ is again a boolean 477 function of the bits of  $\mathbf{f}(\mathbf{x} \wr \overline{r}, k_{1}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$  and  $\mathbf{f}(\mathbf{x} \wr \overline{r}, k_{2}(\wr \overline{u} \wr \wr), \mathbf{y} \wr \mathbf{z} \wr \mathbf{t})$ . Here,
- this boolean function can be computed by a boolean circuit of polylogarithmic depth,
- <sup>479</sup> hence, by an alternating procedure in polylogarihtmic time. The arguments behind this
- remark are the same as the ones in the proof of A(logspace, polylogtime) = NC.

# 481 **7** Concluding Remarks

Theorems 7, 9, 11, and 13 rely on mutual recursive schemes. As stated above, we use these mutual schemes to express a space computation of size  $k \log(n)$  for any constant k, with binary strings of length at most  $\log(n) + c$ . If we were to use only non-mutual recursion schemes, we would need to have longer binary strings. This can be achieved by taking as input to our functions, not simply the Offset, but some larger string  $\#^k(Offset)$ , where  $\#^k$  is a function that appends k copies of its argument.

It also remains to be checked wether one can refine Theorem 13 to provide characterizations of the classes  $NC^i$  as in [13]. A first step in this direction is to define a recursion rank, accounting for the nesting of recursion schemes: then, check wether NC-tropical functions of rank *i* are computable in  $NC^i$ . Conversely, check also whether the simulation of Theorem 7 induces a fixed overhead, and wether  $NC^i$  can be encoded by NC-tropical functions of rank *i* + *c* for some constant *c* small enough.

Finally, note that we characterize logarithmic space functions with logarithmically long output (Theorem 9), and NC functions with one-bit output (Theorem 13). As usual, polynomially long outputs for these classes can be retrieved via a pointer access: it suffices to parameterize these functions with an additional, logarithmically long input, denoting the output bit one wants to compute. In order to retrieve functions with polynomially long output, this approach could also be added to the syntax, with a Write construct similar to our Read construct, for writing the output.

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#### Appendix 546

In this section we provide the definitions of the L-tropical functions used in the proof of 547 Theorem 7, and the subsequent theorems. We also provide more details on the RATM 548 simulation performed in this proof. 549

#### Some Assumptions on the RATM being simulated 550

Let f be a function computable in deterministic space  $k \log(n)$ , with output of size  $k \log(n)$ , 551

- The machine M uses one pointer tape, of size  $\lceil \log(n+1) \rceil$ , and exactly one computation tape.
- For every input  $\overline{x}$  of length n, the machine uses exactly  $k \cdot \lceil \log(n+1) \rceil$  cells on the computation tape.
- 557 At the start of the computation, the computation tape is as follows.
- <sup>558</sup> 1. The computation tape is on a cell containing the **0** symbol, followed by  $k \cdot \lceil \log(n+1) \rceil 1$ <sup>559</sup> **0** cells on the right.
- <sup>560</sup> 2. The cells on the left of the computation head, and the cells on the right of the  $k \cdot \lceil \log(n+1) \rceil$  0 symbols, contain only blank symbols.
- <sup>562</sup> Moreover, during the computation, the following holds.
- <sup>563</sup> 1. The computation head never goes on any cell on the left of its initial position.
- <sup>564</sup> **2.** The machine never writes a blank symbol.
- <sup>565</sup> The same assumptions are made for the pointer tape.

It is easy to check that these assumptions are benign. They enable us to ignore the blank symbol in the simulation, and have a strict correspondence between the binary symbols of the RATM and those of the L-tropical algebra.

# 569 Encoding Machine Configurations

- 570 We need to encode the four following datas:
- 1. Machine state. Assume M has S states, with initial state numbered 0 and final state numbered 1. A machine state t is encoded by a binary string of length  $\lceil \log(S+1) \rceil$ , consisting in the binary encoding of t, padded with **0** symbols if necessary.
- 2. Computation tape. We only need to encode the  $k \cdot \lceil \log(n+1) \rceil$  cells on the right of the initial head position (including itself). These cells never contain a blank symbol during the computation, we can therefore encode them in binary. We encode them in a k-tuple of binary sequences of length  $\lceil \log(n+1) \rceil$ .
- 3. Computation head. The position of the computation head is encoded by a binary string of length  $k.\lceil \log(n+1) \rceil$ , with a **1** symbol on the position of the head, and **0** symbols everywhere else. This binary sequence is given by a k-tuple of binary strings of length  $\lceil \log(n+1) \rceil$ .
- <sup>582</sup> 4. Pointer tape. The pointer tape has size  $\lceil \log(n+1) \rceil$ : it is therefore encoded by a binary <sup>583</sup> string of length  $\lceil \log(n+1) \rceil$ .
- <sup>584</sup> **5.** Pointer tape head. The position of the pointer tape head is encoded by a binary string <sup>585</sup> of length  $\lceil \log(n+1) \rceil$ , with a **1** symbol on the position of the head, and **0** symbols <sup>586</sup> everywhere else.
- The encoding of the machine configuration is then given by the (2k+3)-tuple of the above binary strings.

Notation-wise, in our simulation, we use the variable name  $\bar{s}$  for recursion schemes on the size of the input: that is, such recursion schemes are meant to be initially called with an argument  $\bar{s} = \text{Offset}$  of length L(n). Similarly, we use the variable name  $\bar{t}$  for recursion schemes on the computation time.

# 594 7.0.0.1 Boolean values and connective

We encode booleans false and true with  $s_0(\varepsilon \wr \wr \wr)$  and  $s_1(\varepsilon \wr \wr \wr)$  respectively. We define the following match construct

<sup>602</sup> as the following degenerate tropical recursion on notations.

Then, if then esle, and AND and OR boolean functions are obtained by trivial applications of the match construct above. We also use a function isempty, for testing if a string equals  $\varepsilon$ .

### 610 7.0.0.2 1-bit concatenation

611 Adding one-bit in first position.

616

For notational purposes we sometimes use  $hd( \wr \wr \wr \overline{x}).\overline{y}$  instead.

# 618 7.0.0.3 Tail extraction

Extracting the tail of a string, for a given prefix length.

$$\begin{aligned} \mathsf{Te}(\,\,\wr\,\,\mathbf{s}_a(\overline{x}\,\wr\,\wr\,\wr\,)\,\,\wr\,\overline{e}\,\wr\,) &= \;\; \mathsf{tl}(\,\,\wr\,\,\mathsf{Te}(\,\,\wr\,\overline{x}\,\wr\,\overline{e}\,\wr\,)\,\wr\,) \\ \mathsf{Te}(\,\,\iota\,\varepsilon\,\wr\,\overline{e}\,\iota\,) &= \;\; \overline{e} \end{aligned}$$

619

# 620 7.0.0.4 Bit extraction

Extracting one bit of a string, for a given prefix length.

$$\mathsf{Be}(\wr \wr \wr \overline{x}, \overline{e}) = \mathsf{hd}(\wr \wr \wr \mathsf{Te}(\wr \overline{x} \wr \overline{e} \wr))$$

# 622 7.0.0.5 Head extraction

<sup>623</sup> Extracting the head a string, for a given prefix length.

625 626

#### 627 7.0.0.6 Prefix length Computation

Extract the initial subsequence of **0** only symbols, followed by the first **1**. This function is used for computing the prefix length corresponding to the position of the head in our encoding of the tapes of the RATM.

### 636 7.0.0.7 Length Comparison

A predicate for comparing string lengths

 $\texttt{SameLength}(\wr \overline{x}, \overline{y} \wr \wr) =$ 

AND( $\wr$  isempty( $\wr$  Te( $\wr \overline{x} \wr \wr \overline{y}$ )  $\wr \wr$ ), isempty( $\wr$  Te( $\wr \overline{y} \wr \wr \overline{x}$ )  $\wr \wr$ )  $\wr \wr$ ).

637

#### **7.0.0.8** One bit replacement

Replacing exactly one bit in a string  $\overline{e}$  by the first bit of  $\overline{b}$ , for a given prefix length  $\overline{x}$ .

```
\begin{array}{rcl} \operatorname{Cb}(\ \wr \ \mathbf{s}_a(\overline{x} \wr \wr \wr ) \wr \wr \overline{y}, \overline{e}, \overline{b}) &= \\ & \quad \text{if SameLength}(\ \wr \ \mathbf{s}_a(\overline{x} \wr \wr \wr ), \overline{y} \wr \wr ) \\ & \quad \text{then } \operatorname{hd}(\ \wr \ \wr \ \overline{b}).\operatorname{Cb}(\ \wr \ \overline{x} \wr \ \wr \overline{y}, \overline{e}, \overline{b}) \\ & \quad \text{else } \operatorname{Be}(\ \wr \ \wr \ \mathsf{Te}(\ \wr \ \mathbf{s}_a(\overline{x} \wr \wr \wr ), \overline{e} \wr ), \overline{e}).\operatorname{Cb}(\ \wr \ \overline{x} \wr \ \wr \ \overline{y}, \overline{e}, \overline{b}) \\ & \quad \operatorname{Cb}(\ \wr \ \varepsilon \wr \wr \ \overline{y}, \overline{e}, \overline{b}) &= \ \varepsilon \end{array}
```

and

```
\texttt{ChBit}(\ \wr \ \overline{s} \ \wr \ \overline{x}, \overline{e}, \overline{b}) = \texttt{Cb}(\ \wr \ \overline{s} \ \wr \ \texttt{Te}(\ \wr \ \overline{x} \ \wr \ \overline{e}), \overline{e}, \overline{b})
```

639 for any  $\overline{s}$  with  $|\overline{s}| = |\overline{e}|$ .

### 640 Reading and Updating a Configuration

<sup>641</sup> The Prefix function above computes the prefix corresponding the position of the head of

<sup>642</sup> the pointer and of the computation heads in our encoding. Used in conjunction with the

 $_{643}$  boolean constructs on the k strings encoding the computation tape, and in conjunction with

the bit extraction function Be above, it allows to read the current symbol on the computation

tape, and on the pointer tape, of the encoding of the RATM. Updating these two symbols is
 performed with the ChBit in-place one-bit replacement function.

Similarly, moving the heads of these two tapes can easily be performed with this ChBit, in conjunction with the tl and  $s_1$  basic tropical functions.

Let us now describe how we can read and update the machine state: This machine state 649 is encoded in binary by a string of length  $\lceil \log(S+1) \rceil$ , where S is the number of the states 650 of M. The length of this string is fixed, and does not depend on the input. Therefore, we 651 can safely assume that we have a fixed decision tree of depth  $\lceil \log(S+1) \rceil$ , for reading each 652 bit of this string. The leaves of this decision tree are in one-to-one correspondence with the 653 states of M. This decision tree can moreover be encoded with basic tropical functions and 654 tropical composition only. Similarly, overwriting the machine state can be done with basic 655 tropical functions and tropical composition only. 656

<sup>657</sup> Finally, when in an input reading state, the input tape symbol is obtained simply by <sup>658</sup> using the basic tropical function **Read**, with the pointer tape as argument.

The transition map **Next** of the RATM is then obtained by a boolean composition of the above functions. Similarly, computing an encoding of the initial configuration, and reading a

<sup>661</sup> final configuration, is simple.