# Forging tropical signatures

Lorenz Panny

Technische Universität München, Germany lorenz@yx7.cc

**Abstract.** A recent preprint [2] suggests the use of polynomials over a tropical algebra to construct a digital signature scheme "based on" the problem of factoring such polynomials, which is known to be NP-hard. This short note presents two very efficient forgery attacks on the scheme, bypassing the need to factorize tropical polynomials and thus demonstrating that security in fact rests on a different, empirically easier problem.

**Keywords:** Cryptanalysis, tropical algebra, digital signatures, factorization.

## 1 Introduction

Tropical algebra is concerned with the *min-plus semiring*, an algebraic structure over the extended reals defined by the two binary operations "min" and "+". Multiple candidate cryptographic constructions using tropical semirings in some way or another were suggested in a series of papers starting about ten years ago, and, to a large extent, broken. Readers may wish to consult the introduction of [1] for an overview of the proposals and corresponding attacks in the literature.

The most recent proposal [2] in the tropical-cryptography family is a signature scheme building on multiplication of polynomials over a tropical semiring. In this note, we give two fairly simple, yet very effective forgery attacks against the scheme and show that the attacker is in fact not required to solve the claimed hard problem underneath the construction. We provide implementations of both attacks, confirming that they work in practice.

These results also highlight the need for clear problem statements and unambiguous claims concerning the relationships between them: The signature scheme of [2] may be "based on" the factorization problem for tropical polynomials in the sense that it is *inspired by* that problem. However, there is no known result indicating that breaking the signature would be as hard as factoring tropical polynomials, and indeed, our attacks strongly suggest the opposite.

As a side remark, we also note that the emphasis of [2] on the NP-hardness of factoring tropical polynomials misses the point: Cryptography requires computational problems that are hard *for almost all instances*, while the notion of NP-hardness only says something about the hardest, possibly very few instances. See the classic paper [4] for an informal overview of average-case complexity.

 $<sup>^{*}</sup>$  Date of this document: 2023-11-11.

## 1.1 Tropical polynomials

For our purposes, the *tropical semiring*  $\mathbb{T}$  is defined as the set  $\mathbb{Z} \cup \{+\infty\}$  with two binary operations  $a \oplus b = \min\{a, b\}$  and  $a \otimes b = a + b$ . Tropical polynomials are simply symbolic expressions

$$f(x) = c_0 \oplus (c_1 \otimes x) \oplus (c_2 \otimes x^{\otimes 2}) \oplus \cdots \oplus (c_n \otimes x^{\otimes n})$$

with  $c_0, ..., c_n \in \mathbb{T}$  and a variable x; they too form a semiring under the operations  $\oplus$  and  $\otimes$  extended to polynomials in the usual way. Note that "missing" coefficients are interpreted as  $+\infty$ .

Example 1. In more usual notation,  $f(x) = \min\{c_0, c_1 + x, c_2 + 2x, ..., c_n + nx\}.$ 

Example 2. The tropical polynomial product  $f(x) \otimes g(x)$  has coefficients  $c_0 + c'_0$ ,  $\min\{c_0 + c'_1, c_1 + c'_0\}$ ,  $\min\{c_0 + c'_2, c_1 + c'_1, c_2 + c'_0\}$ , etc., where  $c_i$  and  $c'_j$  are the coefficients of f(x) and g(x) respectively. Generally, the  $k^{\text{th}}$  coefficient equals

$$\min \left\{ c_i + c'_{k-i} : i \in \{0, ..., k\} \right\}.$$

Remark 3. Beware that there are at least two notions of "tropical polynomial" in the literature: One is the algebraic viewpoint employed in [2] and here. The other identifies polynomials with the *functions* they define on  $\mathbb{R}$ . In the latter formalism, all tropical polynomials split uniquely into linear tropical polynomials and the factors can be found in polynomial time; see for instance [3].

### 1.2 Signatures from tropical polynomials

The signature scheme proposed by [2] features two integer parameters d and r; the values suggested in [2, §4] are d=150 and r=127. Let  $U_{d,r}$  denote the set of tropical polynomials of degree d and with all coefficients between 0 and r, and let H be a collision-resistant hash function from bit strings to  $U_{d,r}$ .

The <u>public key</u> is a tropical product  $M = X \otimes Y$ , where (X, Y) are tropical polynomials sampled uniformly from  $U_{d,r}$ . A valid <u>signature</u> for a message m is a triple  $(S_1, S_2, N)$  of tropical polynomials with  $S_1, S_2 \in U_{3d,3r}$  and  $N \in U_{2d,2r}$ , such that  $S_1 \otimes S_2 = P \otimes P \otimes M \otimes N$  where P = H(m); in addition, neither  $S_1$  nor  $S_2$  may be a constant multiple of  $P \otimes M$  or  $P \otimes N$ .

## 2 The attacks

The problem of recovering a secret key for a given public key really is factoring (with some extra constraints on the degree and coefficient sizes). However, the problem of forging a signature gives significantly more power to the attacker: Their task is to factor when another factorization is already known!

In more detail, recall that a signature consists of a triple  $(S_1, S_2, N)$  of tropical polynomials such that  $S_1 \otimes S_2 = P \otimes P \otimes M \otimes N$ , where M is the public key and P

is a hash value of the message encoded as a tropical polynomial in a suitable way. Setting  $S_1 = P \otimes M$  and  $S_2 = P \otimes N$  solves the verification equation but clearly does not require knowledge of the secret; hence, this pair and its constant multiples are excluded as "trivial forgeries" in [2]. However, in tropical algebra, polynomial multiplication is highly non-cancellable, and a tropical polynomial typically has a very large number of distinct product decompositions. All attacks explained in the sequel are based on different methods of discovering new product decompositions starting from a given one.

Note that we focus on the most basic version of each attack for simplicity, and that the forged signatures produced by those methods look rather different from honestly generated signatures. We can (and will) however speculate that any particular method of detecting forgeries can be fooled by carefully combining and adjusting the basic forgery techniques. Indeed, since chaining these basic strategies may prove useful, it is helpful to view them not just as one-shot forgery attacks, but as transformations on pairs  $(S_1, S_2)$  of tropical polynomials which produce another pair  $(S'_1, S'_2)$  such that  $S'_1 \otimes S'_2 = S_1 \otimes S_2$ , while preserving superficial properties like the degrees and bounds on the coefficients.

#### 2.1 Warmup: "Trivial forgeries"

The most trivial forgery would be  $(P \otimes M, P \otimes N, N)$  for any N with the correct degree and coefficient bounds. A mild generalization is to (tropically) multiply the three components by constants in  $\mathbb{T}$  in such a way that the verification equation and coefficient bounds remain satisfied; this yields signatures of the form  $(c_1 \otimes P \otimes M, c_2 \otimes P \otimes N, c_1 \otimes c_2 \otimes N)$ . Forgeries of this type are detected and rejected by the verification algorithm specified in [2]. However, they form a big part of the following stronger attacks in the sense that they provide the initial product decomposition  $(S_1, S_2) = (P \otimes M, P \otimes N)$  of  $P \otimes P \otimes M \otimes N$ .

#### 2.2 Attack #1: Morphing products

The starting point for the first attack is to recall Example 2 and notice that there will almost certainly be coefficients  $c_i$  and  $c'_j$  in the inputs  $(S_1, S_2)$  which effectively do not contribute to the result at all: Only the smallest sum  $c_i + c'_{k-i}$  in each coefficient of the product matters; the remaining information disappears under the minimum. This phenomenon is particularly pronounced for the middle coefficients, where each minimum runs over a large number of individual sums  $c_i + c'_i$ .

Hence, the idea is to search for small modifications to the coefficients of both  $S_1 = P \otimes M$  and  $S_2 = P \otimes N$  which do not spoil the final product. The simplest conceivable approach is to first find a single coefficient  $c_i$  in  $S_1$  such that setting  $c_i \leftarrow c_i \pm 1$  preserves the product with  $S_2$ , and then find a single coefficient  $c_j'$  in  $S_2$  such that setting  $c_j' \leftarrow c_j' \pm 1$  preserves the product with that modified  $S_1$ . Experimentally, for the parameter choices suggested in [2], there appears to be plenty of freedom in  $S_1$  and  $S_2$  to produce a forgery that passes verification.

We stress again that there is no reason to stop at modifying a single coefficient in each value by  $\pm 1$  only; hence, the obvious countermeasure of banning values of  $S_1$  and  $S_2$  which are "close to"  $P \otimes M$  or  $P \otimes N$  is insufficient.

#### 2.3 Attack #2: Swapping divisors

The second attack is based on the simple observation that divisors of  $S_1$  can be moved over to  $S_2$ , and vice versa, without changing the value of the product  $S_1 \otimes S_2$ . Notably, a full factorization of the respective polynomials is not needed, and finding small-degree divisors appears to be significantly easier — if they exist. Empirically, generic constraint solvers are capable of computing (or ruling out) divisors of reasonably small degree very quickly; see Section 2.4.

Forging signatures thus works as follows: Search for a message such that  $P \otimes M$  can be decomposed as  $D_1 \otimes R_1$  with  $\deg(D_1) \ll \deg(R_1)$ . Once found, search for a nonce N as in the legitimate signing algorithm that can be decomposed as  $D_2 \otimes R_2$  with  $\deg(D_2) = \deg(D_1)$ . The signature is  $(D_1 \otimes R_2, D_2 \otimes R_1, N)$ . In practice, executing this forgery becomes a little easier by directly assembling N with a suitable pre-existing known factor, rather than searching randomly.

#### 2.4 Attack implementation

We provide Python code for both attack varieties, using the proof-of-concept implementation of [2] to check that forgeries were successful. While the script for attack #1 is entirely elementary, the script for attack #2 makes use of the Python interface to the z3 solver [5] to find divisors of tropical polynomials up to degree 5. (This cutoff was chosen pretty arbitrarily.)

Both attacks require no more than a few seconds of computation on average. Code: https://yx7.cc/files/tropical-attack.tar.gz

#### References

- [1] Ivan Buchinskiy, Matvei Kotov and Alexander Treier. Analysis of four protocols based on tropical circulant matrices. IACR Cryptology ePrint Archive 2023/1707. 2023. URL: https://ia.cr/2023/1707.
- [2] Jiale Chen, Dima Grigoriev and Vladimir Shpilrain. *Tropical cryptography III: digital signatures*. IACR Cryptology ePrint Archive 2023/1475. 2023. URL: https://ia.cr/2023/1475.
- [3] Nathan Grigg and Nathan Manwaring. An Elementary Proof of the Fundamental Theorem of Tropical Algebra. 2007. arXiv: 0707.2591.
- [4] Russell Impagliazzo. "A personal view of average-case complexity". In: *Proceedings of Structure in Complexity Theory*. 1995, pp. 134–147.
- [5] Leonardo de Moura and Nikolaj Bjørner. "Z3: An Efficient SMT Solver". In: Tools and Algorithms for the Construction and Analysis of Systems. Springer, 2008, pp. 337–340. URL: https://github.com/Z3Prover/z3.