Fast* Implementations of Finite Fields and Elliptic Curves in Lean 4

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https://github.com/mpenciak/LLL2023



Outline

- Motivation: What we're building at Lurk Lab
- A bit about zero knowledge cryptography
- Optimizing FF arithmetic
 - Addition chains for fast exponentiation
 - Batched inversion
 - Montgomery form
- Optimizing elliptic Curve arithmetic
 - Choice of coordinates
 - Efficient endomorphisms
 - Multi-scalar multiplication
- Brief demo!
- Lessons learned and future outlook



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What is Lurk? Lurk is a turing complete programming language in the style of Lisp which generates zero knowledge proofs of execution.

If I run a Lurk program f, I can prove things like:

- I have run the computation of f applied to u and gotten v
- I know an input u to f such that f(u) = v without revealing u
- I can commit ahead of time to a program f and run it on any inputs
 {u} you provide with proofs of execution.



A little about zero knowledge proofs

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- An interactive proof scheme (the "information-theoretic" component)
- A commitment scheme (the "cryptographic" component)

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A **commitment scheme** is an interactive protocol for one party to commit to some data (a vector, polynomial, etc...) without revealing its value. The commitment can be opened later, and it should be computationally infeasible for the committer to change their committed value

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- ② V chooses randomly between $\{1,2\}$ and sends the choice i to P
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It is not: non-interactive, or succinct

The goal is to build **Z**ero **K**nowledge **S**uccinct **Ar**guments of **K**nowledge (ZK SNARKs) in Lean.



The basic building blocks for cryptography

Work over finite fields, and encode our computations in so-called "arithmetic circuits".

The level of security necessary is measured in the number of "bits" of security. To prevent a dishonest prover from forging a fraudulent proof, a good estimate is ≈ 128 bits of security.

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Example 1: The fastest (publicly) known factorization/discrete logarithm algorithm is the general number field sieve method with complexity

$$\exp\left(\left(\sqrt[3]{\frac{64}{9}}+o(1)\right)(\log n)^{\frac{1}{3}}(\log\log n)^{\frac{2}{3}}\right)$$

To achieve pprox 128 bits of security we need to work over finite fields of size $\approx 2^{2048}$

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Hasse's bound, makes it "easy" to find elliptic curves with enough points – if E is an elliptic curve defined over a finite field with p elements, then the number of points N is bounded by:

$$|N-(p+1)|\leq 2\sqrt{p}$$

When we discuss curves, we will see some magical curves with extra nice properties



Big numbers in Lean

Most computers don't natively support arithmetic for numbers larger than $2^{64} - 1$, stored in the Lean datatype UInt64.

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which calls the C function defined in lean.h

Multiprecision arithmetic libraries

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- **1** Schoolbook multiplication: $O(n^2)$
- ② Karatsuba multiplication: $O(n^{1.58})$
- **3** Strassen FFT algorithm: $O(n \log n \log \log n)$

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We tried using fixed precision arithmetic based off Lean's ByteArray type instead of Nat.

This turned out to be $\approx 100\times$ slower than Nat, so we quickly dropped that plan.



A comment on benchmarking and testing

Testing and benchmarking is important for non-formalized systems. For testing we have built a testing framework called LSpec which is expressive and easy to use.

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```
#lspec check "add_comm"
    (forall n m : Nat, n + m = m + n)
#lspec check "not true"
    (forall n m : Nat, n^2 + m^2 >= n^3 + m)
? add_comm
x not true
______
Found problems!
n := 2
m := 0
issue: 8 \le 4 does not hold
(1 shrinks)
```

A comment on benchmarking and testing

For benchmarking we have a rudimentary suite of tools for running benchmarks:

```
import YatimaStdLib.Benchmark
import YatimaStdLib.AddChain
open Benchmark
def f1 : Nat \rightarrow Nat := (37 ^ .)
def f2 : Nat → Nat := Exp.fastExp 37
def addChainBench : Comparison f1 f2 where
    inputs := #[10000000, 15000000, ...]
def main (args : List String) : IO UInt32 :=
    benchMain args addChainBench.benchmark
```

Benchmarking continued...

This can be run as Benchmarks-AddChain --num 50 --log out.bench and times the benchmarks and writes to the file:

```
10000000: f:213993503 vs g:236587657

15000000: f:315046597 vs g:335218176

20000000: f:457342988 vs g:537591730

25000000: f:598272104 vs g:681122849

30000000: f:670924537 vs g:743308727

35000000: f:786821581 vs g:940891049

40000000: f:950924114 vs g:1103080520

45000000: f:1108323608 vs g:1213150412

50000000: f:1242277288 vs g:1288141664
```

Back to fields

The arithmetic typeclasses we have (so far):

- Ring: Basic arithmetic: +, *, and so on
- Field: Ring together with inversion
- PrimeField: Arithmetic, plus pre-computations and methods to improve efficiency
- NewField: Automatically generated instance of a PrimeField with special methods related to Montgomery form
- GaloisField: Fields obtained as extension fields of a base field

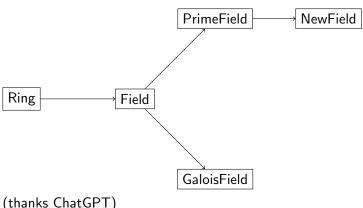
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No Prop valued fields! Nothing is formalized (yet).

Field typeclasses



(thanks ChatGPT)

Example classes

```
class Ring (R : Type _) extends Add R, Mul R, Sub R,
        HPow R Nat R, BEq R, Coe Nat R where
   zero: R
   one: R
class PrimeField (K : Type _) extends Field K where
    char: Nat -- characteristic
    sqrt : K → Option K -- Fast `sqrt` implementation
    content : Nat -- char.log2
   twoAdicity: Nat x Nat -- `(s, r)` where `p-1 = 2^s * r'
   legAC : Array ChainStep -- Pre-computed AddChains to
   frobAC : Array ChainStep -- calculate . p and . (p-1)/2
    fromNat : Nat → K -- to and from `Nat`' methods
   natRepr : K → Nat
    batchedExp : K → Array Nat → Array K
    batchedInv : Array K → Array K
```

AddChains: Exponentiation is a commonly used operation, but can be very slow.

Naive implementation: $a^N = a \cdot a^{N-1}$ is O(N) (too slow)

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For commonly used exponents $(p \text{ and } \frac{p-1}{2})$: pre-compute a minimal length "addition chain": $[n_1, n_2, n_3, ..., n_r = N]$ where each $n_i = n_k + n_l$ for k, l < i.

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Batched inversion

Batched inversion:

Inversion is another costly operation (inversion in $\mathbb{Z}/p\mathbb{Z}$ is $O(\log p)$ using the extended Euclidean algorithm)

To invert $[n_1, n_2, n_3, \ldots, n_r]$, calculate $N_j = \prod_i^j n_i$ for $j = 1, \ldots, r$ caching the results. Invert N_r . Recover all of the n_i^{-1} by multiplying with the cached results.

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Example: Inverting the set [2, 3, 5].

- **1** Calculate $N_1 = 2$, $N_2 = 6$, $N_3 = 30$.
- ② Invert N_3 : $N_3^{-1} = 30^{-1}$, let $t = N_3^{-1}$
- **3** Multiply $t \cdot N_2 = 30^{-1} \cdot 6 = 5^{-1}$, and $t = t \cdot n_3 = 6^{-1}$
- Proceed as before: $t \cdot N_1 = 6^{-1} \cdot 2 = 3^{-1}$, and $t = t \cdot n_2 = 2^{-1}$

This method replaces r field inversions with 1 field inversion and O(3r) field multiplications.



Montgomery form

Problem: How should we calculate $n \cdot m$ in \mathbb{F}_p when we use Nat representatives?

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Intuition behind the solution: Replace reduction modulo p with reduction modulo R for some other R.

Let R > p be a number co-prime to p for which division and reduction modulo R is efficient.

In practice: Choose R to be a power of 2 greater than p.

Represent $n \in \mathbb{Z}/p\mathbb{Z}$ in "Montgomery form" $[n]_w = n \cdot R \mod p$.

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Addition: $[n]_w + [m]_w = (n+m) \cdot R \mod p = [n+m]_w$ Multiplication: $[n]_w \cdot [m]_w = (n \cdot m)R^2 \mod p = [n \cdot m]_w R \mod p$ \longrightarrow Montgomery reduce $[n \cdot m]_w$

NewField implementation

We implemented a macro_rule that expands the following declaration

```
new_field TestField with
   prime: 2011
   generator: 7
   root_of_unity: 2010 -- optional
```

into a type TestField with pre-computations and arithmetic, instances, and methods implemented.

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Not advised to be used yet: Missing some key GMP methods to make Montgomery reduction more efficient (mpz_tdiv_r_2exp).

Part of Montgomery reduction of $a \cdot R \in \mathbb{N}$ involves working modulo R, which is not more efficient in Lean at this time.

Elliptic Curves

Immediate goals are to work with curves defined over fields of large characteristic, so short Weierstrass form is fine:

```
/--
Curves with Weierstrass form satisfying the equation
`y^2 = x^3 + a x + b` for a prime field `F` such that
`char K > 3`
-/
structure Curve (F : Type _) [Field F] where
a : F
b : F
```

Arithmetic on curves

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Projective coordinates avoid field inversions! Affine coordinates are more compact on disk! More exotic coordinate systems have other benefits.

Coordinate breakdown

Figure: Chart taken from *Handbook of Elliptic and Hyperelliptic Curve Cryptography*

Doubling		Addition	
Operation	Costs	Operation	Costs
$2\mathcal{P}$	7M + 5S	$\mathcal{J}^m + \mathcal{J}^m$	13M + 6S
$2\mathcal{J}^c$	5M + 6S	$\mathcal{J}^m + \mathcal{J}^c = \mathcal{J}^m$	12M + 5S
$2\mathcal{J}$	4M + 6S	$J + J^c = J^m$	12M + 5S
$2\mathcal{J}^m = \mathcal{J}^c$	4M + 5S	$\mathcal{J}+\mathcal{J}$	12M + 4S
$2\mathcal{J}^m$	4M + 4S	P + P	12M + 2S
$2A = \mathcal{J}^c$	3M + 5S	$J^c + J^c = J^m$	11M + 4S
$2\mathcal{J}^m = \mathcal{J}$	3M + 4S	$\mathcal{J}^c + \mathcal{J}^c$	11M + 3S
$2A = \mathcal{J}^m$	3M + 4S	$J^c + J = J$	11M + 3S
$2A = \mathcal{J}$	2M + 4S	$\mathcal{J}^c + \mathcal{J}^c = \mathcal{J}$	10M + 2S
_	_	$J + A = J^m$	9M + 5S
_	_	$J^m + A = J^m$	9M + 5S
_	_	$J^c + A = J^m$	8M + 4S
_	_	$\mathcal{J}^c + \mathcal{A} = \mathcal{J}^c$	8M + 3S
_	_	$\mathcal{J} + \mathcal{A} = \mathcal{J}$	8M + 3S
-	_	$\mathcal{J}^m + \mathcal{A} = \mathcal{J}$	8M + 3S
_	_	$A + A = \mathcal{J}^m$	5M + 4S
-	_	$A + A = J^c$	5M + 3S
2A	I+2M+2S	A + A	I+2M+S



Naiive vs. Actual implementation

```
:= t1 - Y3
X3 := t3 * X3
Z_3 := b_3 * Z_3
  := t3 + Z3
Z_3 := Z_3 + Z_3
Z3 := Z3 + Z3
return (X3, Y3, Z3)
```

Reason: Ensure Lean is evaluating the arithmetic expressions to minimize finite field operations.

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This optimization was subject to the patent US7995752B2 Method for accelerating cryptographic operations on elliptic curves which expired in 2020

Some very magical curves

Some very magical curves

 $\begin{array}{l} 0x40000000000000000000000000000000224698 fc0994 a8dd 8c46 eb2100000001 \\ \text{(Vesta)} \end{array}$

Nice properties of the Pasta curves:

- Efficiently computable endomorphism for the GLV optimization.
- **3** Large 2-adicity (p-1) is divisible by 2^{32}
- **6** Both primes are of the form $2^{255} + \epsilon$ which helps with reduction in \mathbb{F}_p
- Both have low-degree isogenies with non-zero *j*-invariant (helps with generating random points on the curves).



Multiscalar Multiplication

The multi-exponentiation problem: Given a set of list of integers $[n_1, n_2, \ldots, n_r]$ and a list of group elements $[g_1, g_2, \ldots, g_r]$ calculate $\prod_{i=1}^{r} g_i^{n_i}$.

Multi-exponentiation in the context of elliptic curve groups asks to calculate $\sum_{i=1}^{r} n_i \cdot G_i$ for points $G_i \in C$.

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Used throughout ECC (signature schemes, commitment schemes, zero knowledge proof schemes).

In some protocols, $\approx 80\%$ of time in generating zero knowledge proofs is spent calculating multiscalar multiplications.

Typical r varies greatly by application, but can get up to sizes like 2^{28} .

Pippenger's algorithm

Pippenger's algorithm is one of the most efficient optimizations over the naive implementation.

Suppose the elliptic curve group order is approximately b bits large. Pick a "window size" c (log r turns out to be optimal) so that $b \approx k \cdot c$.

- **1** Decompose each $n_i = n_{i,0} + n_{i,1} \cdot 2^c + n_{i,2} \cdot 2^{2c} + \ldots + n_{i,k} \cdot 2^{kc}$
- ② Split up the large b-bit MSM into k separate c-bit MSMs:

$$T_i = \sum_{j}^{r} n_{j,i} G_i$$

Solve each c-bit MSM and recombine as $M = \sum_{i=1}^{k} 2^{i} \cdot T_{i}$. (perfect opportunity for parallelization)



Pippenger algorithm

We have reduced to the case of an MSM $T = \sum_{i=1}^{r} n_i \cdot G_i$ where each n_i is at most c-bits.

- **1** Keep track of $2^c 1$ "buckets", and place each G_i into the n_i bucket.
- ② Sum up all the sets of points to get 2^c bucket sums S_j for $j=0,\ldots,2^c-1$

The Lean implementation provides an $\approx 10\times$ speedup over the naive implementation.

Further optimizations exist when each G_i is a fixed shape relative to a generator for the elliptic curve group.

A common case is when $G_i = \tau^i \cdot G$ for i = 0, ..., r and G is a fixed generator for the elliptic curve group.



A small Demo!

All of the above can be found:

https://github.com/yatima-inc/FFaCiL.lean

https://github.com/yatima-inc/yatimastdlib.lean

Lessons learned

- Squeezing performance out of Lean can sometimes feel like squeezing water from a stone.
- Lean 4 does not have "zero cost abstractions".
- Lean 4 is early in its life, so there are few guides written down for writing efficient code.
- There are some significant performance pits to fall in if one isn't careful with the reference counting.

Lessons learned

- Squeezing performance out of Lean can sometimes feel like squeezing water from a stone.
- Lean 4 does not have "zero cost abstractions".
- Lean 4 is early in its life, so there are few guides written down for writing efficient code.
- There are some significant performance pits to fall in if one isn't careful with the reference counting.
- Lean 4 is incredibly expressive, it's easy to prototype complex structures and algorithms that *just work* on the first try.
- The resulting code is beautiful, and very easy to read.
- With time, more FFI work, and more effort I'm certain performance can be competitive.



Future goals

- (short term) Optimize, optimize, optimize! (deeper GMP integration, more curve forms, ...).
- (short-medium term) Expand FFaCiL to include more elliptic curve cryptography (isogenies!).
- (short-medium term) Actually take advantage of dependent types.
- (medium term) Begin exploring the formalization of provable security (formalizing adversarial games, and complexity).
- (long term) Expand the Yatima Standard Library with more number theoretic primitives.
- 6 (Long term) Begin the process of formally verifying these algorithms!
- (Epochs from now) Combine all of these efforts together into a cryptolib with formally verified cryptographic algorithms.



Thank you for your time!

Thanks!

References

TODO