

# Demystifying Zero-Knowledge Proofs

Elena Nadolinski

@leanthebean

elena@beanstalk.network



# Who is this workshop for:

- No prior knowledge necessary
- Some experience with Solidity smart contracts
- Basic math

Where to get these slides & links

**Twitter: @leanthebean**

# What we'll go over

## **Part 1 - theory**

- Some background knowledge
- Overview of how ZKPs work

## **Part 2 - coding**

- Use Zokrates to make a smart contract that will generate NFT tokens only if the correct proof to a puzzle is given

Coding Part:

# What we'll go over

## Part 2 - coding

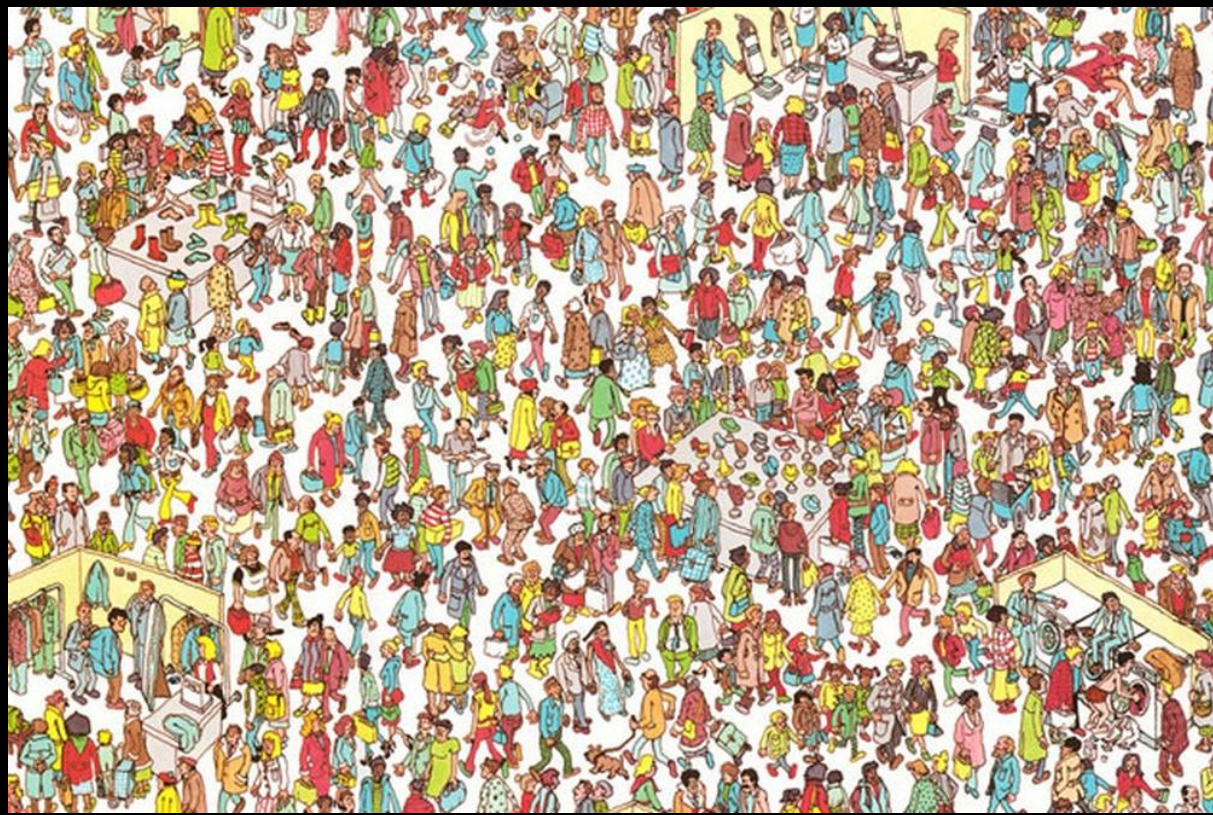
- <https://github.com/leanthebean/puzzle-hunt>
- Install Docker & Zokrates

What is a ZKP?

# What is a ZKP?

The ability to prove honest computation  
without revealing inputs









# ZKPs $\neq$ privacy

SNARKs

STARKs

Bulletproofs

ZKPs ==  
honest computation

$$f(x) = y$$

+ proof

$$f(x) = y$$



- Merkle path to my commitment notes that cover my transaction
- Entire Blockchain

$$f(x) = y$$




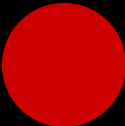



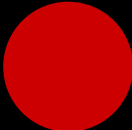
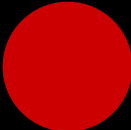


- Change to a smart contract
  - One machine does the computation, all others accept new state change with a proof



# History

- 1985 "The Knowledge Complexity of Interactive Proof-Systems"
- Shafi Goldwasser, Silvio Micali, and Charles Rackoff
- <http://web.mit.edu/~ezyang/Public/graph/svg.html>

	Proof Size	Prover Time	Verification Time
SNARKs (has trusted setup)			
STARKs			
Bulletproofs			

	Proof Size	Prover Time	Verification Time
SNARKs (has trusted setup)	288 bytes	2.3s	10ms
STARKs	45KB-200KB	1.6s	16ms
Bulletproofs	~1.3KB	30s	1100ms

# Projects using ZKPs

SNARKs



Zcash: has optional **shielded transactions** that use zk-SNARKs

Has a ceremony for the trusted setup per circuit upgrade

# Projects using ZKPs

## SNARKs

■ CODA

Use **recursive SNARKs** to give a merkle root of latest global state with a proof

New nodes do not have to sync from the genesis block to build up their in-memory global state

# Projects using ZKPs

## Bulletproofs



Use Bulletproofs for more efficient **range proofs only** and **not for privacy directly**

# Projects using ZKPs

zk-STARKs



Batching transactions off-chain for a decentralized exchange  
(DEX)

# Open Source Projects

SNARKs	<p><a href="#">Zokrates</a> a great SNARK domain specific language (DSL) for generating proofs and validating them on Ethereum</p> <p><a href="#">Bellman</a> Rust implementation</p> <p><a href="#">Snarky</a> OCaml implementation (DSL)</p> <p><a href="#">Libsnark</a> C++</p> <p>Iden3's <a href="#">Circum</a> (DSL) &amp; <a href="#">SnarkJS</a> Javascript Implementation</p> <p>Republic Protocol's <a href="#">zksnark-rs</a> (DSL) Rust implementation</p> <p><a href="#">DIZK</a> Java Distributed system</p> <p><a href="#">Go-SNARK</a> zkSNARK library implementation in Go</p>
STARKs	<p><a href="#">Go implementation</a> (with pretty useful links!)</p> <p><a href="#">C++ implementation</a></p>
Bulletproofs	<p><a href="#">Ristretto</a> Rust implementation with GREAT documentation (maintained by Chain/Interstellar)</p> <p><a href="#">Benedikt's Bunz Java implementation</a></p>



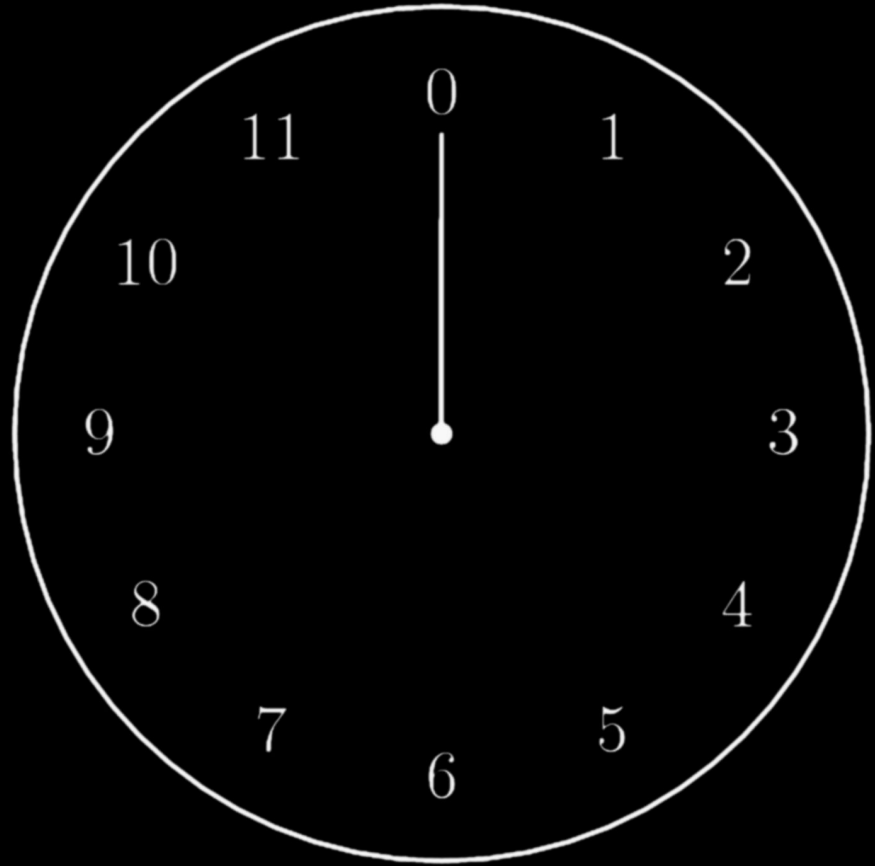
# Modular Math

$$22 \pmod{12} = 10$$

Because 12 divides 22 one time evenly with 10 as the remainder

$$3 + 16 \pmod{12} = 7$$

And so on



# Diffie Hellman (1976)

- First published method of public-key cryptography
- Secret sharing of an encryption key

(Learn more on early cryptography from [The Code Book](#))

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)
2. Alice chooses a secret  $a = 4$ , and sends Bob  $A = g^a \bmod p$ 
  - $A = 5^4 \bmod 23 = 4$

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)
2. Alice chooses a secret  $a = 4$ , and sends Bob  $A = g^a \bmod p$ 
  - $A = 5^4 \bmod 23 = 4$
3. Bob chooses a secret  $b = 3$ , and sends Alice  $B = g^b \bmod p$ 
  - $B = 5^3 \bmod 23 = 10$

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)
2. Alice chooses a secret  $a = 4$ , and sends Bob  $A = g^a \bmod p$ 
  - $A = 5^4 \bmod 23 = 4$
3. Bob chooses a secret  $b = 3$ , and sends Alice  $B = g^b \bmod p$ 
  - $B = 5^3 \bmod 23 = 10$
4. Alice computes  $s = B^a \bmod p$ 
  - $s = g^{ba} \bmod p = 10^4 \bmod 23 = 18$

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)
2. Alice chooses a secret  $a = 4$ , and sends Bob  $A = g^a \bmod p$ 
  - $A = 5^4 \bmod 23 = 4$
3. Bob chooses a secret  $b = 3$ , and sends Alice  $B = g^b \bmod p$ 
  - $B = 5^3 \bmod 23 = 10$
4. Alice computes  $s = B^a \bmod p$ 
  - $s = g^{b \cdot a} \bmod p = 10^4 \bmod 23 = 18$
5. Bob computes  $s = A^b \bmod p$ 
  - $s = g^{a \cdot b} \bmod p = 4^3 \bmod 23 = 18$

# Diffie Hellman (1976)

1.  $p = 23$  (modulus)  $g = 5$  (base)
2. Alice chooses a secret  $a = 4$ , and sends Bob  $A = g^a \bmod p$ 
  - $A = 5^4 \bmod 23 = 4$
3. Bob chooses a secret  $b = 3$ , and sends Alice  $B = g^b \bmod p$ 
  - $B = 5^3 \bmod 23 = 10$
4. Alice computes  $s = B^a \bmod p$ 
  - $s = g^{ba} \bmod p = 10^4 \bmod 23 = 18$
5. Bob computes  $s = A^b \bmod p$ 
  - $s = g^{ab} \bmod p = 4^3 \bmod 23 = 18$

*Now Alice and Bob know to encrypt/decrypt their messages using the shared secret 18*



# RSA (1977)

- One of the first public key cryptosystems
- Uses Diffie-Hellman
- Digital Signatures

# RSA

1. Choose 2 primes:  $p = 5$   $q = 11$   
 $n = p * q = 55$

# RSA

1. Choose 2 primes:  $p = 5$   $q = 11$   
 $n = p * q = 55$
2.  $\text{lcm}(p-1, q-1) = 40$  (totient)

# RSA

1. Choose 2 primes:  $p = 5$   $q = 11$   
 $n = p * q = 55$
2.  $\text{lcm}(p-1, q-1) = 40$  (totient)
3. Choose a private key  $e$  that is  $1 < e < 40$  (coprime to 40)  
 $e = 7$

# RSA

1. Choose 2 primes:  $p = 5$   $q = 11$   
 $n = p * q = 55$
2.  $\text{lcm}(p-1, q-1) = 40$  (totient)
3. Choose a private key  $e$  that is  $1 < e < 40$  (coprime to 40)  
 $e = 7$
4. Choose a public key  $d$  such that  
 $d * e \bmod(\text{totient}) = 1$   
 $d = 23$

# RSA

private key  $e = 7$  and public key  $d = 23$   
message to sign =  $8$

# RSA

private key  $e = 7$  and public key  $d = 23$   
message to sign =  $8$

$$c = 8^7 \bmod 55 = 2$$

# RSA

private key  $e = 7$  and public key  $d = 23$   
message to sign = 8

$$c = 8^7 \bmod 55 = 2$$

Anyone can check the signature using the public key 23



# RSA

private key  $e = 7$  and public key  $d = 23$   
message to sign =  $8$

$$c = 8^7 \bmod 55 = 2$$

Anyone can check the signature using the public key  $23$

$$m = 2^{23} \bmod 55 = 8$$

# Fiat-Shamir (1986)

- Interactive proof of knowledge
- “Grandfather” of ZKPs
- Allows one to prove information about a number, without revealing the number

# Fiat-Shamir

- *$g$  is a number (called generator) everyone knows*

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$
- Bob picks a random  $c$ , and sends that to Alice

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$
- Bob picks a random  $c$ , and sends that to Alice
- Alice sends back  $r = v - cx$

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$
- Bob picks a random  $c$ , and sends that to Alice
- Alice sends back  $r = v - cx$
- Bob checks  $t = g^{r + cy}$



# Fiat-Shamir

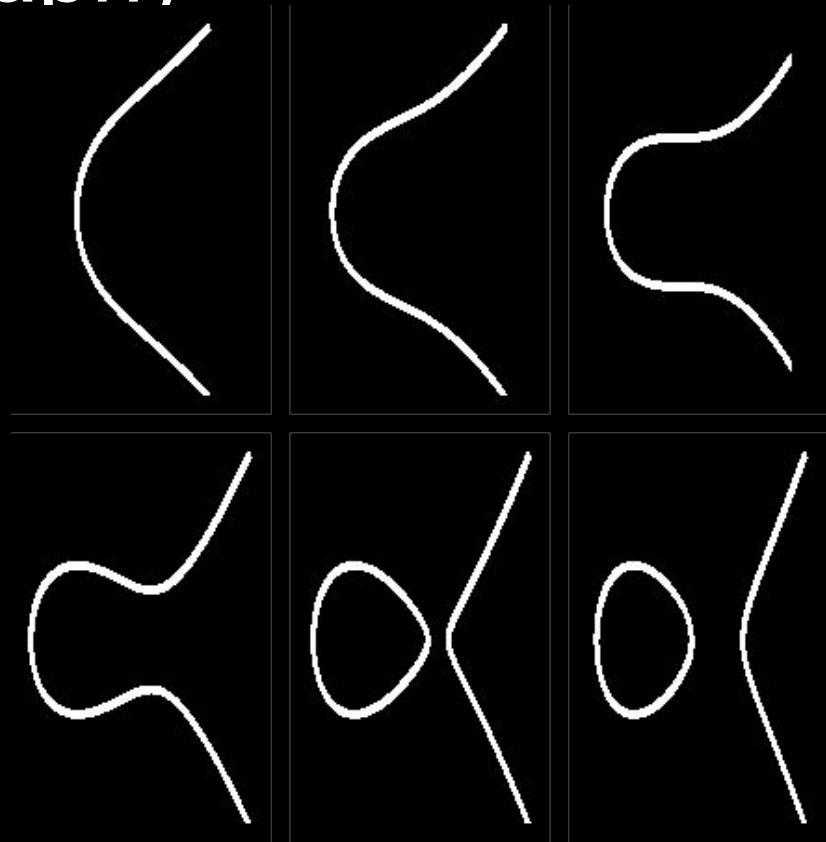
- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$
- Bob picks a random  $c$ , and sends that to Alice
- Alice sends back  $r = v - cx$
- Bob checks  $t = g^r y^c$
- Since  $g^r y^c = g^{v-cx} g^{xc} = g^v = t$

# Fiat-Shamir

- $g$  is a number (called generator) everyone knows
- Alice wants to prove that she knows  $x$ , such that  $y = g^x$
- She picks a random  $v$ , and sends  $t$  such that  $t = g^v$
- Bob picks a random  $c$ , and sends that to Alice
- Alice sends back  $r = v - cx$
- Bob checks  $t = g^r y^c$
- Since  $g^r y^c = g^{v-cx} g^{xc} = g^v = t$
- **Bob knows that Alice knows the “preimage”  $x$**

# Elliptic Curve Cryptography

- Much more powerful and efficient tool than exponentiation & modular math



# Elliptic Curve Cryptography

- Much more powerful and efficient tool than exponentiation & modular math
- [Great tutorial](#) by Andrea Corbellini
  - (much of which we'll go over here)

$$y^2 = x^3 + ax + b$$

(where  $4a^3 + 27b^2 \neq 0$ )

# Elliptic Curve Cryptography

~ ¾ of 100k top websites use ECDHE (https://)  
(Elliptic Curve Diffie-Hellman Exchange)

96.1% of those use P256 curve (a NIST standard):

$$y^2 = x^3 - 3x + b \pmod{p}$$

Parameters generated from hashing a seed

From a [video by Dan Boneh](#)

# Elliptic Curve Cryptography

~ ¾ of 100k top websites use ECDHE (<https://>)

(Elliptic Curve Diffie-Hellman Exchange)

96.1% of those use P256 (prime 256-bit standard):

$$y^2 = x^3 + ax + b \pmod{p}$$

Parameters generated from hashing of seed

From a [video by Dan Boneh](#)

# Elliptic Curve Cryptography

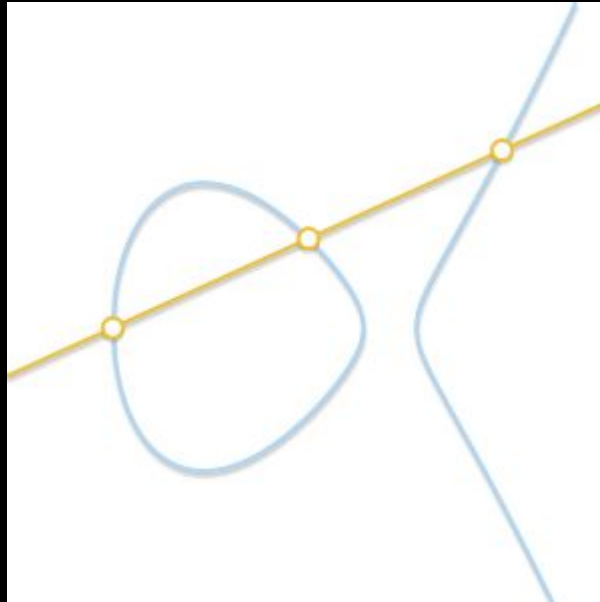
**Abelian Group Properties** for a set  $\mathbb{G}$

- 1) **Closure:** if  $a$  and  $b$  are members of  $\mathbb{G}$  then  $a + b$  is also
- 2) **Associativity:**  $(a + b) + c = a + (b + c)$
- 3) **Identity:**  $a + 0 = 0 + a = a$
- 4) **Inverse:** for every  $a$ , there exists  $b$  such that  $a + b = 0$
- 5) **Commutativity:**  $a + b = b + a$



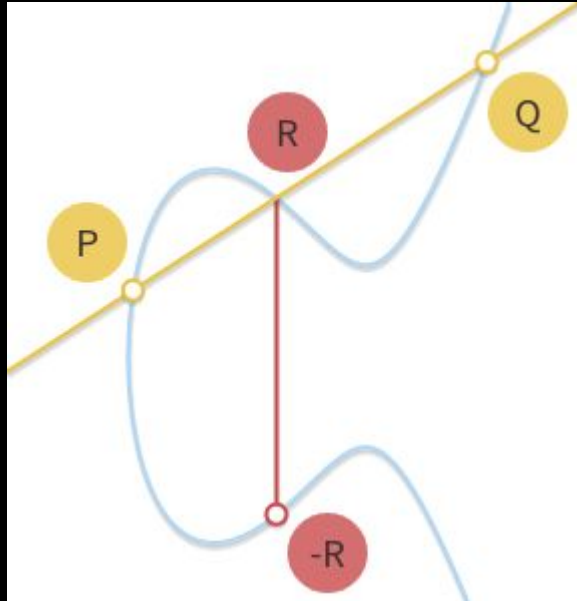
# ECC - Addition

Given 3 aligned non-zero points, their sum is:  $P + Q + R = 0$



# ECC - Addition

If  $P + Q + R = 0$ , then  $P + Q = -R$



If we draw a line between 2 pts P and Q, it'll intersect at a point R

Since  $P + Q = -R$  we can easily find R and use it to compute addition of two points from it

# ECC - Addition

$$P + Q = -R$$

$$m = (3x_p^3 + a) / 2y_p$$

$$x_R = m^2 - x_p - x_Q$$

$$y_R = y_p + m(x_R - x_p) = y_Q + m(x_R - x_Q)$$

# ECC - Addition

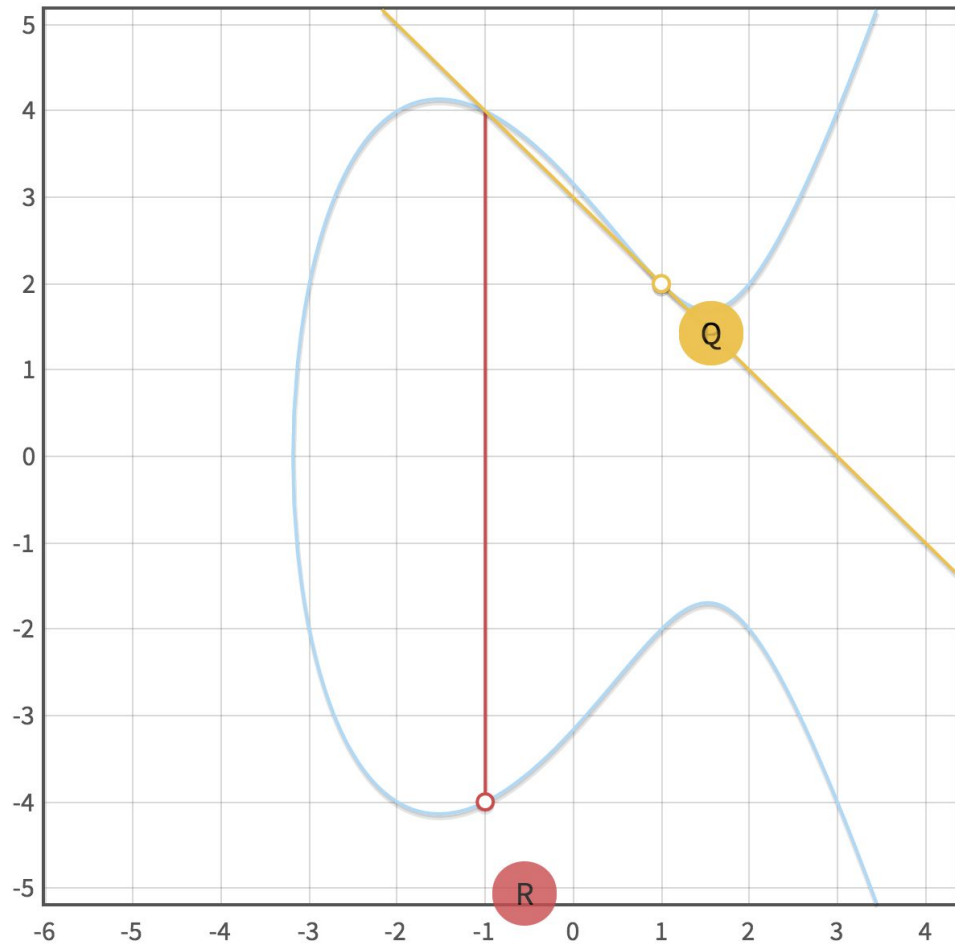
$$P + P = -R \quad \text{for } Q = P = (1, 2) \text{ on } y^2 = x^3 - 7x + 10$$

$$m = (3x_p^2 + a) / 2y_p = -1$$

$$x_R = m^2 - x_p - x_Q = -1$$

$$y_R = y_P + m(x_R - x_P) = y_Q + m(x_R - x_Q) = 4$$

$$\text{So } P + P = (-1, -4)$$



Curve: a  b

P: x  y

Q: x  y

$R = P + Q$ : x  y

Point addition over the elliptic curve  $y^2 = x^3 - 7x + 10$  in  $\mathbb{R}$ .

# ECC - Multiplication

$$nP = P + P + \dots + P$$

 n times

(We have clever optimization techniques to do this fast)

# ECC - Multiplication

$$nP = P + P + \dots + P$$

 n times

$nP = Q$  : fairly easily to compute

$n = Q/P$  : very hard to compute (no efficient method)

**Logarithm Problem** (it's not called division for conformity reasons)

# ECC - Multiplication

$$nP = P + P + \dots + P$$

 n times

$nP = Q$  : fairly easily to compute

$n = Q/P$  : very hard to compute (no efficient method)

**Logarithm Problem** (it's not called division for conformity reasons)

*But we're missing cycles*

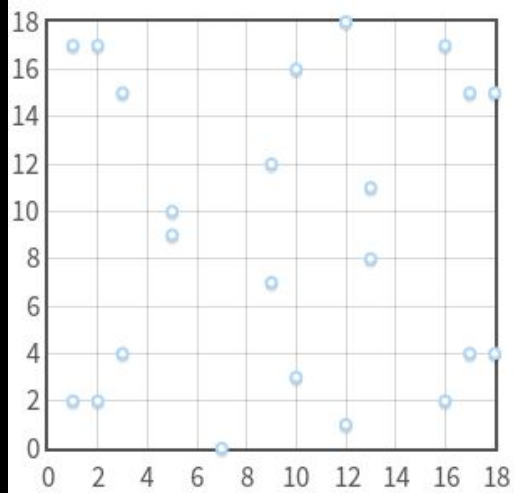


# ECC - Finite Fields & Discrete Log

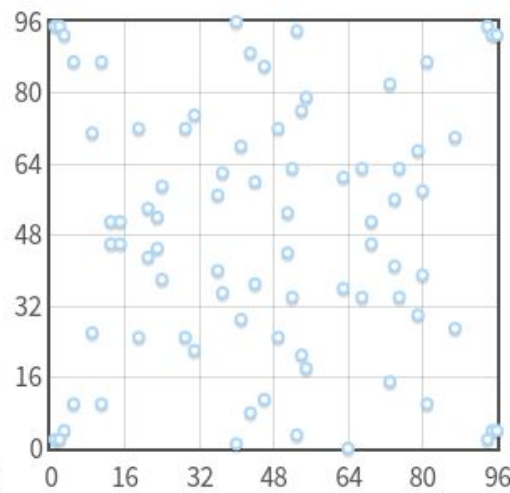
Finite field  $\mathbb{F}_p$ : set of elements (mod  $p$ ) where  $p$  is prime

$$y^2 = x^3 + ax + b \pmod{p}$$

$p = 19$

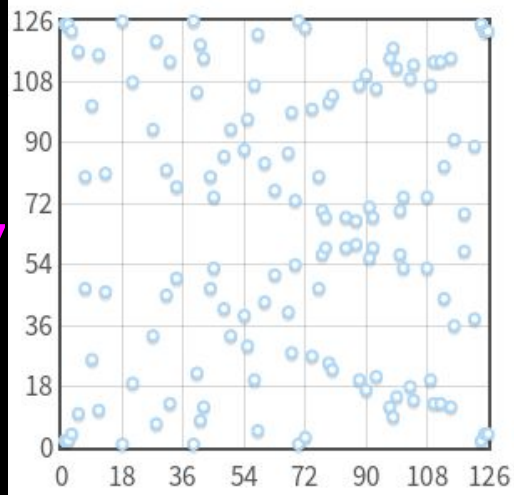


$p = 97$

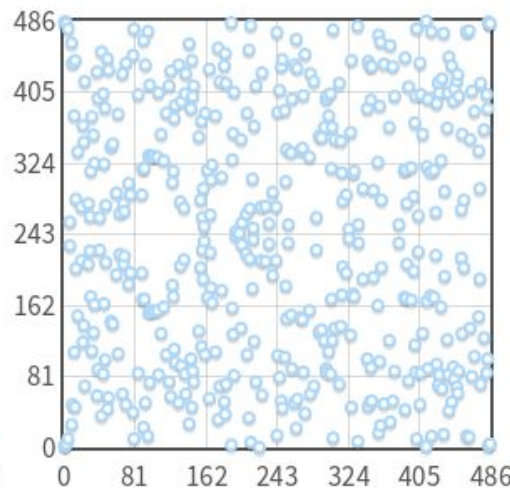


$$y^2 = x^3 - 7x + 10$$

$p = 127$



$p = 487$



# ECC - Finite Fields (Addition)

$P + P = ?$  in a finite field

# ECC - Finite Fields (Addition)

$P + P = ?$  in a finite field

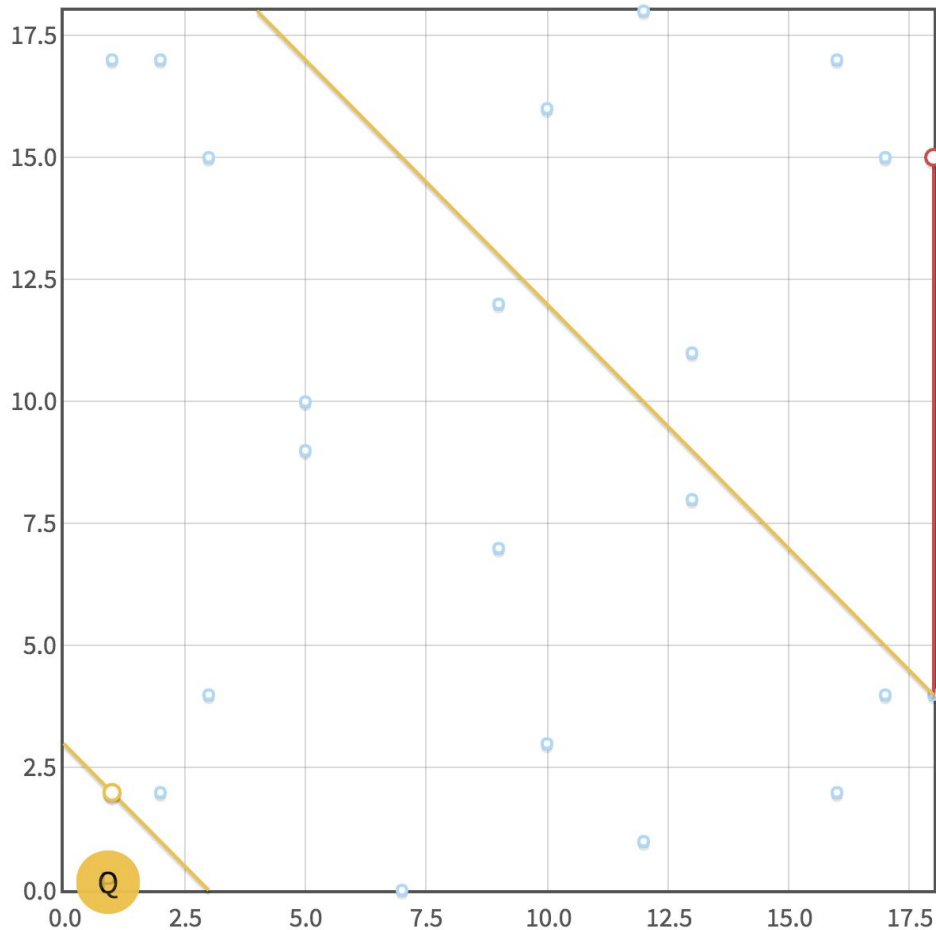
$P + P = (-1, -4)$  on  $y^2 = x^3 - 7x + 10$

For a finite field on  $p = 19$

$$-1 \pmod{19} = 18$$

$$-4 \pmod{19} = 15$$

So  $P + P$  on  $y^2 = x^3 - 7x + 10 \pmod{19} = (18, 15)$



R

Curve: a -7 b 10

Field: p 19

P: x 1 y 2

Q: x 1 y 2

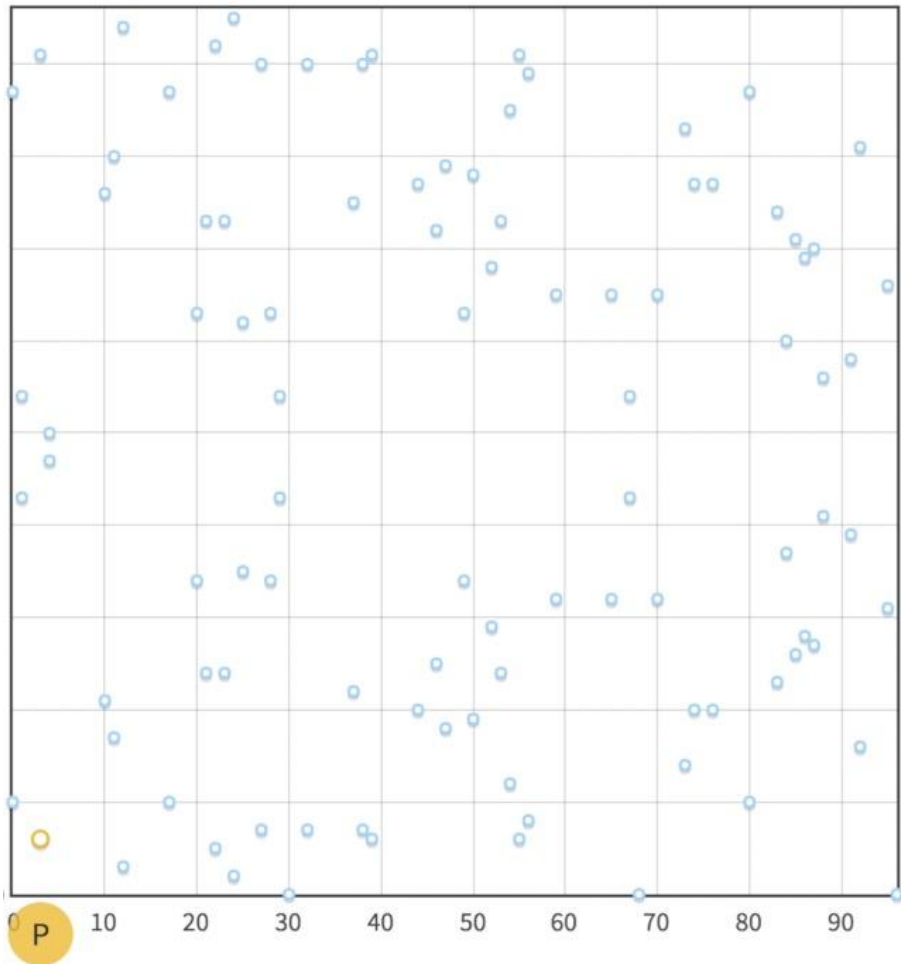
$R = P + Q$ : x 18 y 15

Point addition over the elliptic curve  $y^2 = x^3 - 7x + 10$  in  $\mathbb{F}_{19}$ .  
The curve has 24 points (including the point at infinity).

# ECC - Groups

$$y^2 = x^3 + 2x + 3 \pmod{97} \quad \text{at point } P(3, 6)$$

Let's calculate some multiples of P



Curve:

Field:

$n$ :

$P$ :

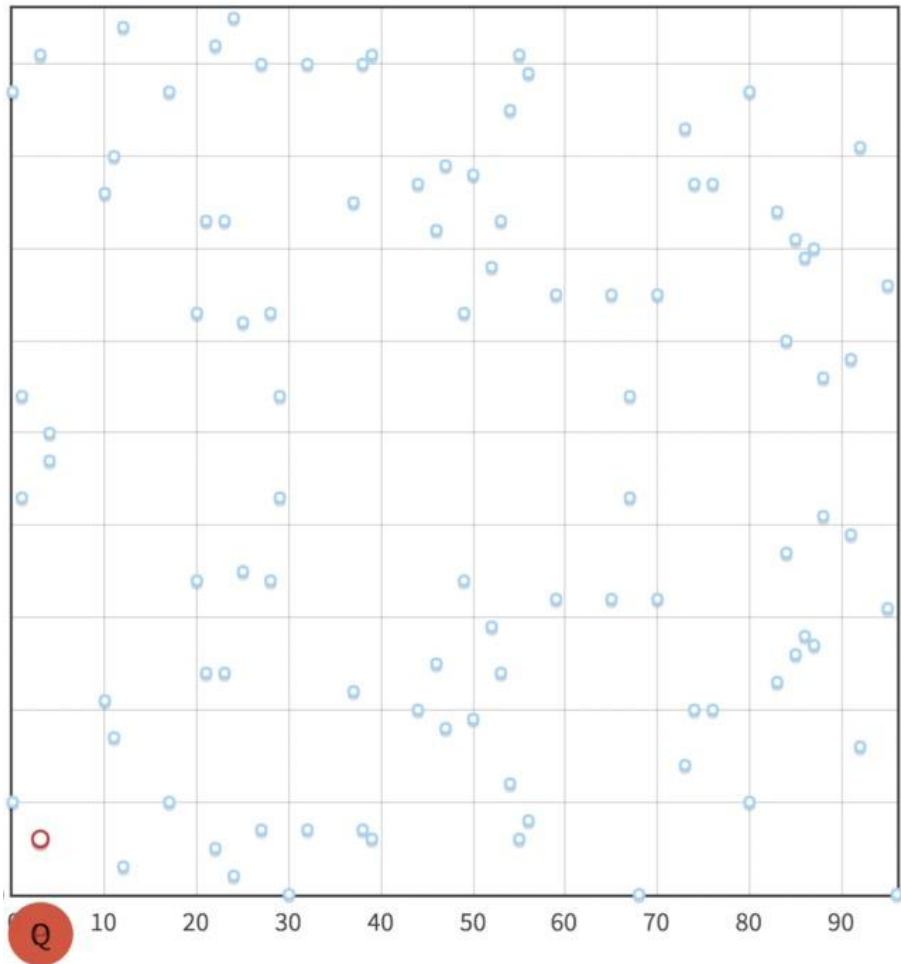
$Q = n \cdot P$ :

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 0$**



Curve: a 2 b 3

Field: p 97

n: n 1

P: x 3 y 6

$Q = n \cdot P$ : x 3 y 6

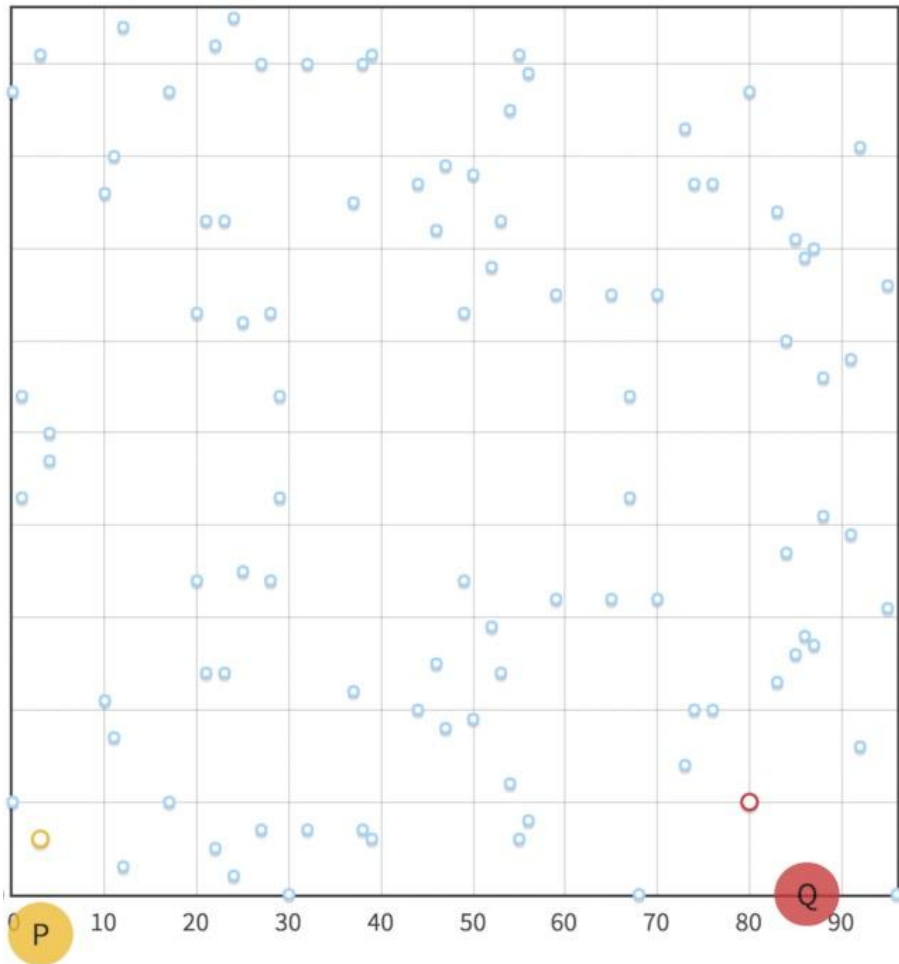
Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**n = 1**





Curve: a 2 b 3

Field: p 97

n: n 2

P: x 3 y 6

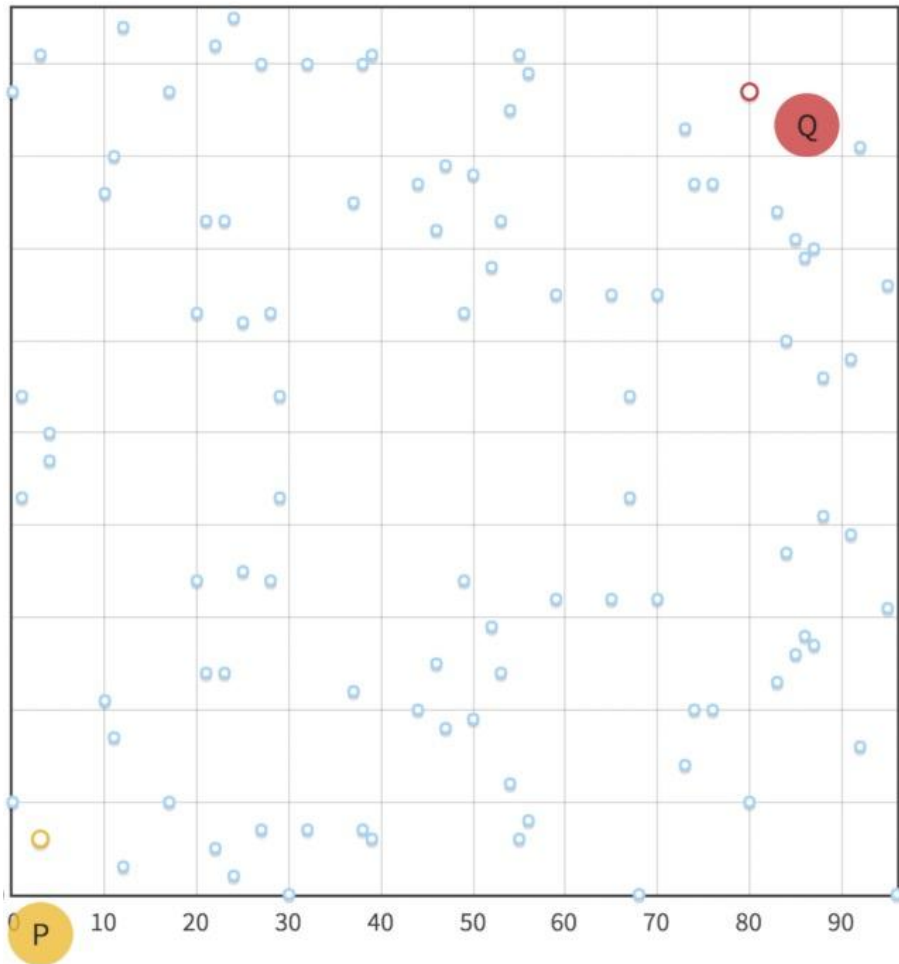
$Q = n \cdot P$ : x 80 y 10

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**n = 2**



Curve:

Field:

$n$ :

$P$ :

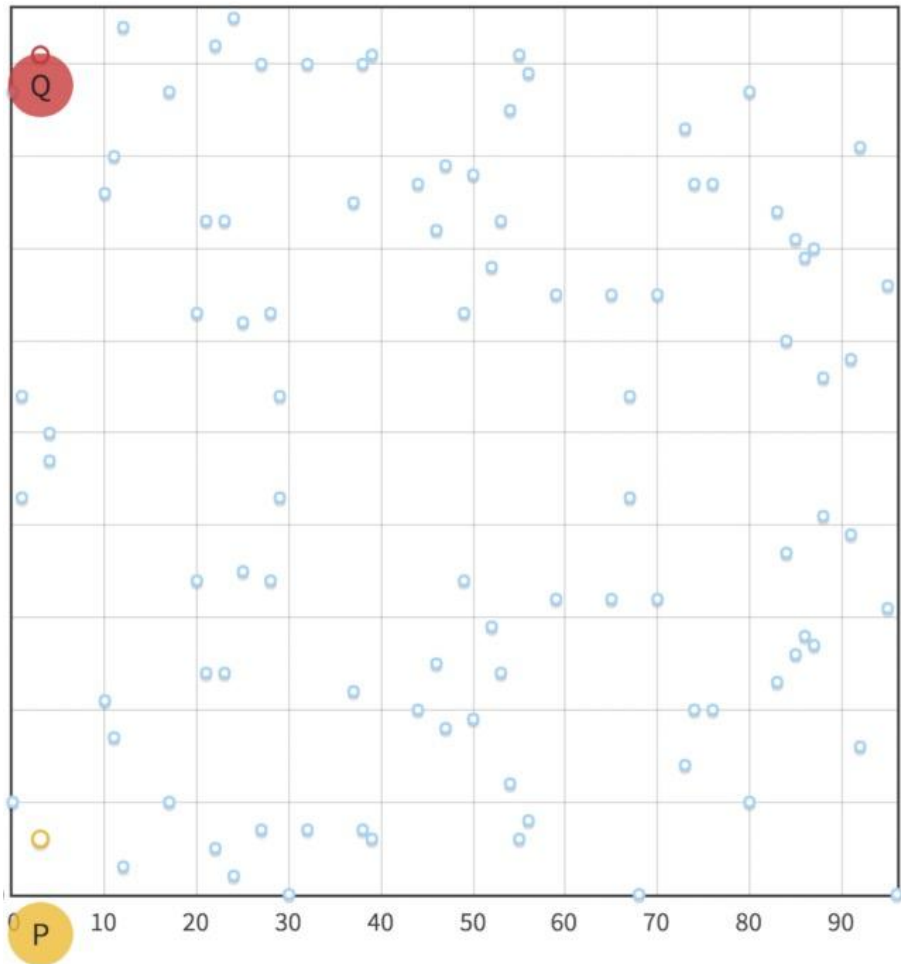
$Q = n \cdot P$ :

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

$$n = 3$$



Curve: a 2 b 3

Field: p 97

n: n 4

P: x 3 y 6

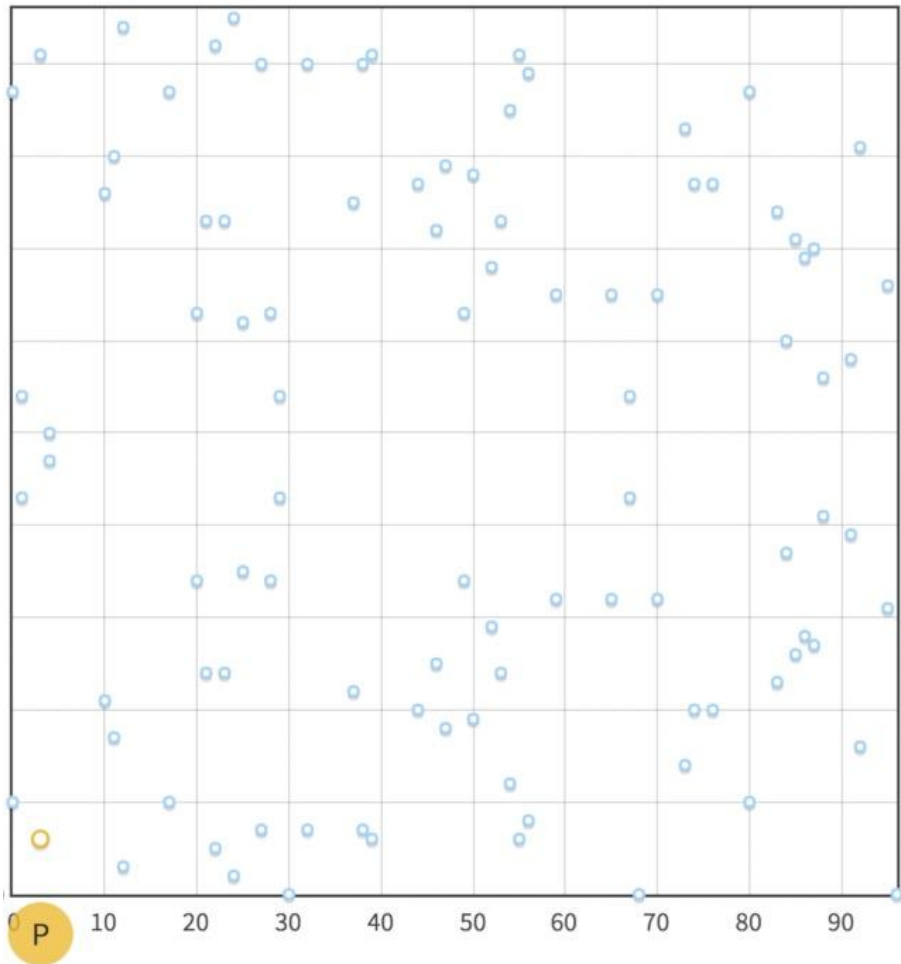
$Q = n \cdot P$ : x 3 y 91

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**n = 4**



Curve: a 2 b 3

Field: p 97

n: n 5

P: x 3 y 6

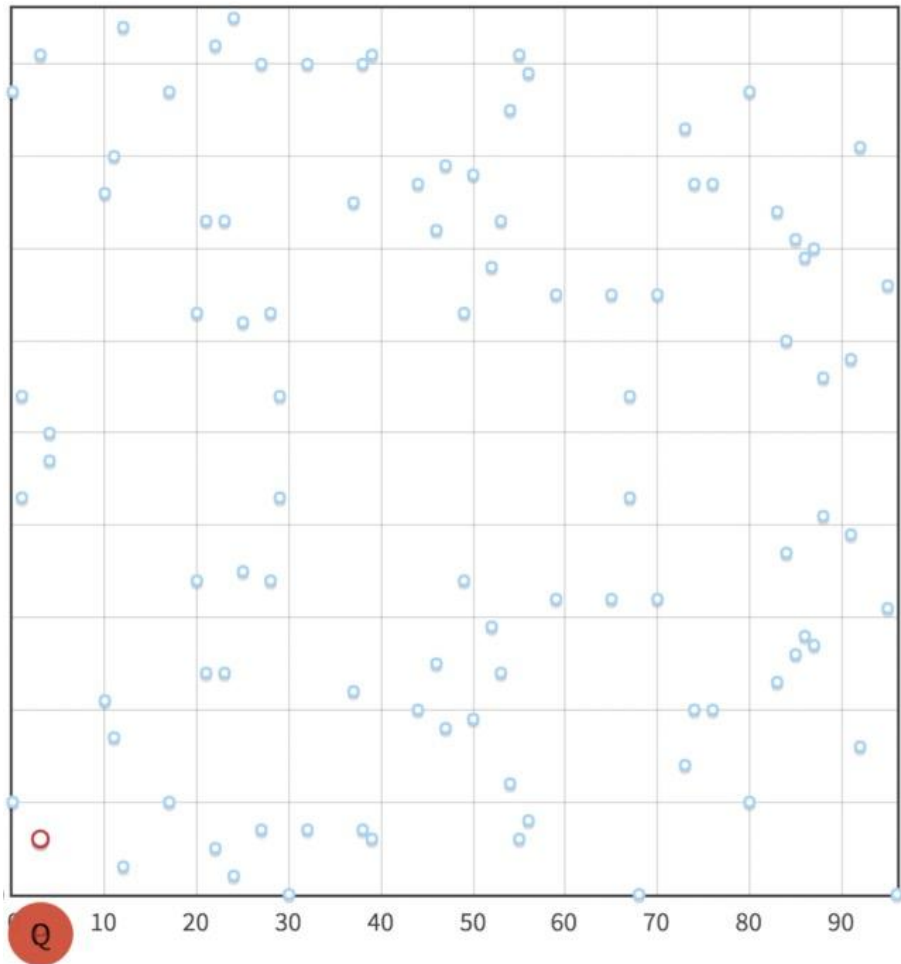
$Q = n \cdot P$ : x Inf y Inf

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 5$**   
**Same as  $n = 0$**



Curve: a 2 b 3

Field: p 97

n: n 6

P: x 3 y 6

$Q = n \cdot P$ : x 3 y 6

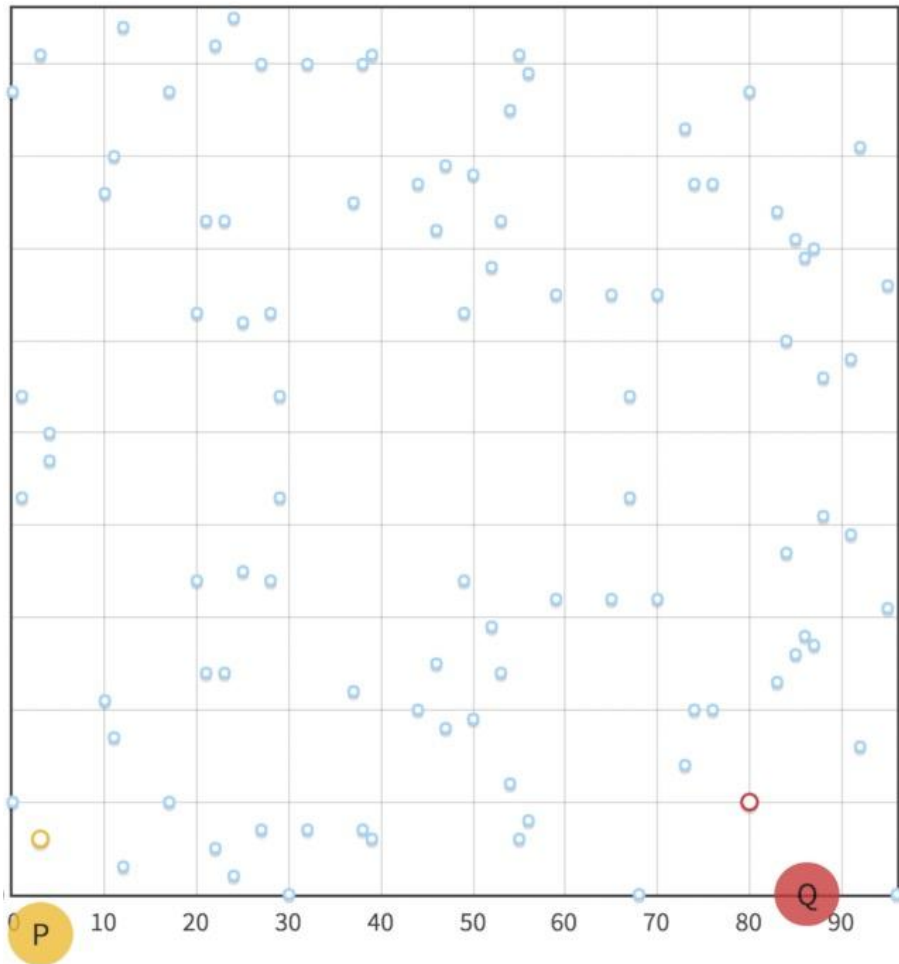
Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 6$**

**Same as  $n = 1$**



Curve: a 2 b 3

Field: p 97

n: n 7

P: x 3 y 6

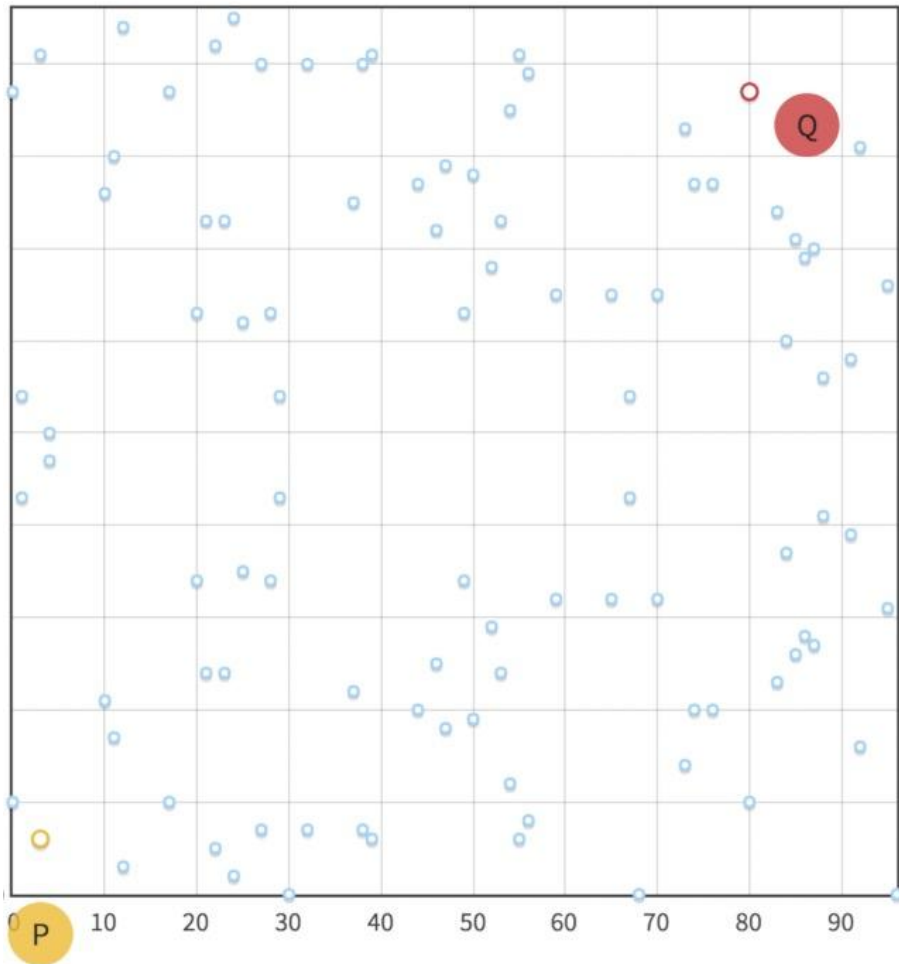
$Q = n \cdot P$ : x 80 y 10

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 7$**   
**Same as  $n = 2$**



Curve: a 2 b 3

Field: p 97

n: n 8

P: x 3 y 6

$Q = n \cdot P$ : x 80 y 87

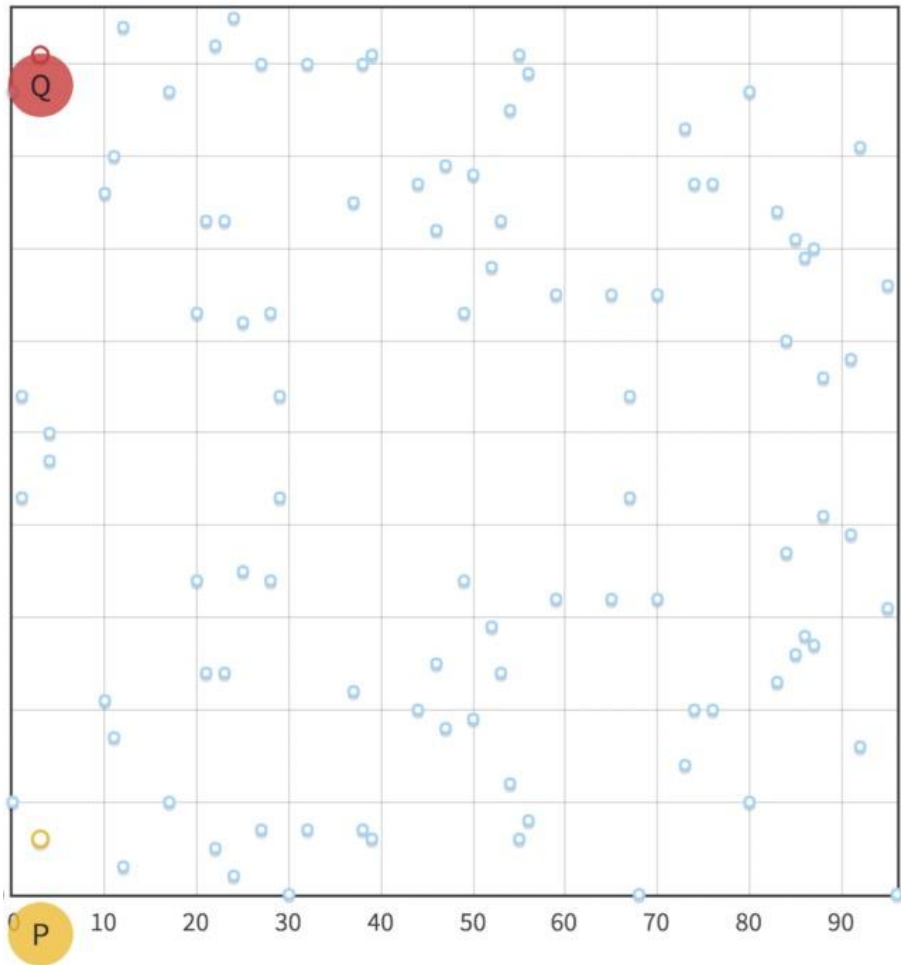
Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 8$**

**Same as  $n = 3$**



Curve: a 2 b 3

Field: p 97

n: n 9

P: x 3 y 6

$Q = n \cdot P$ : x 3 y 91

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

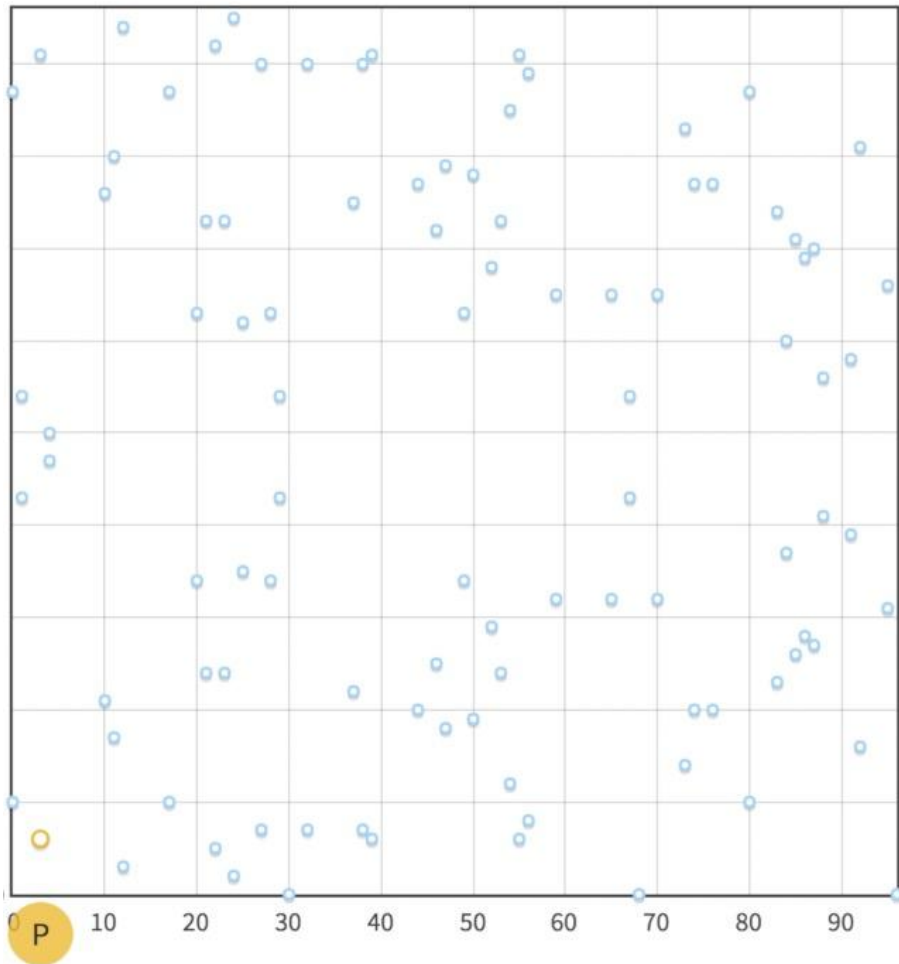
The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 9$**

**Same as  $n = 4$**





Curve: a 2 b 3

Field: p 97

n: n 10

P: x 3 y 6

$Q = n \cdot P$ : x Inf y Inf

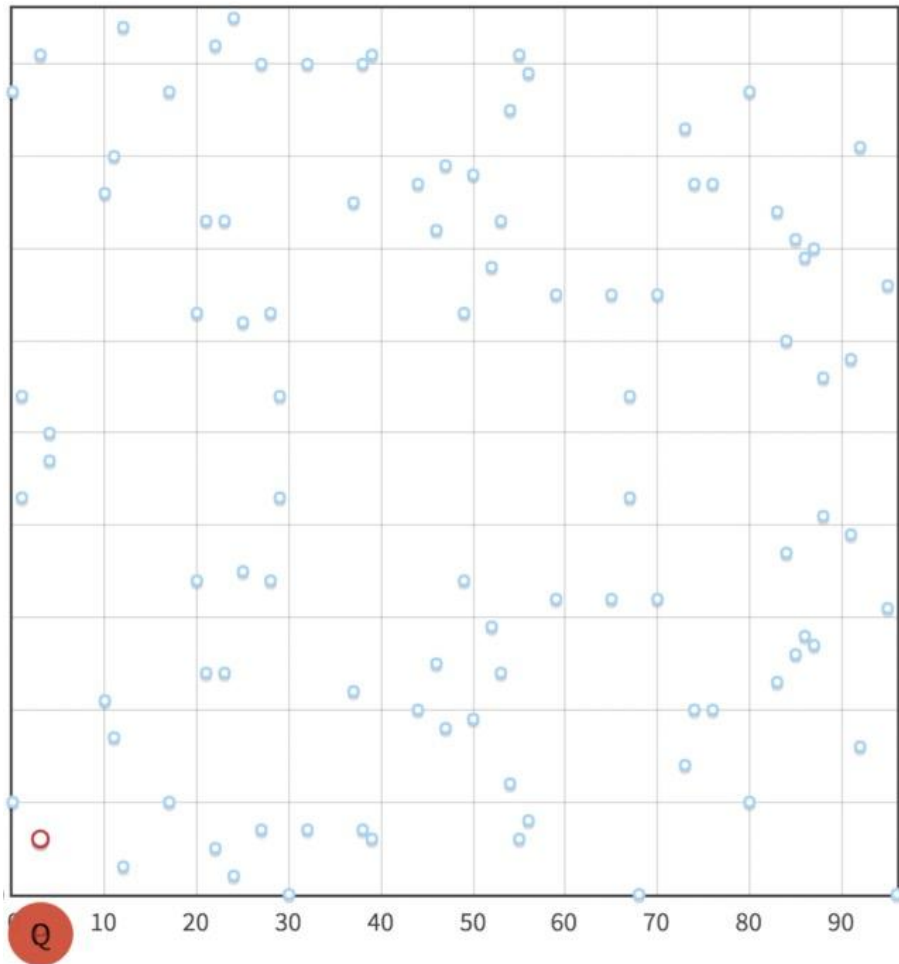
Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 10$**

**Same as  $n = 5, 0$**



Curve: a 2 b 3

Field: p 97

n: n 11

P: x 3 y 6

$Q = n \cdot P$ : x 3 y 6

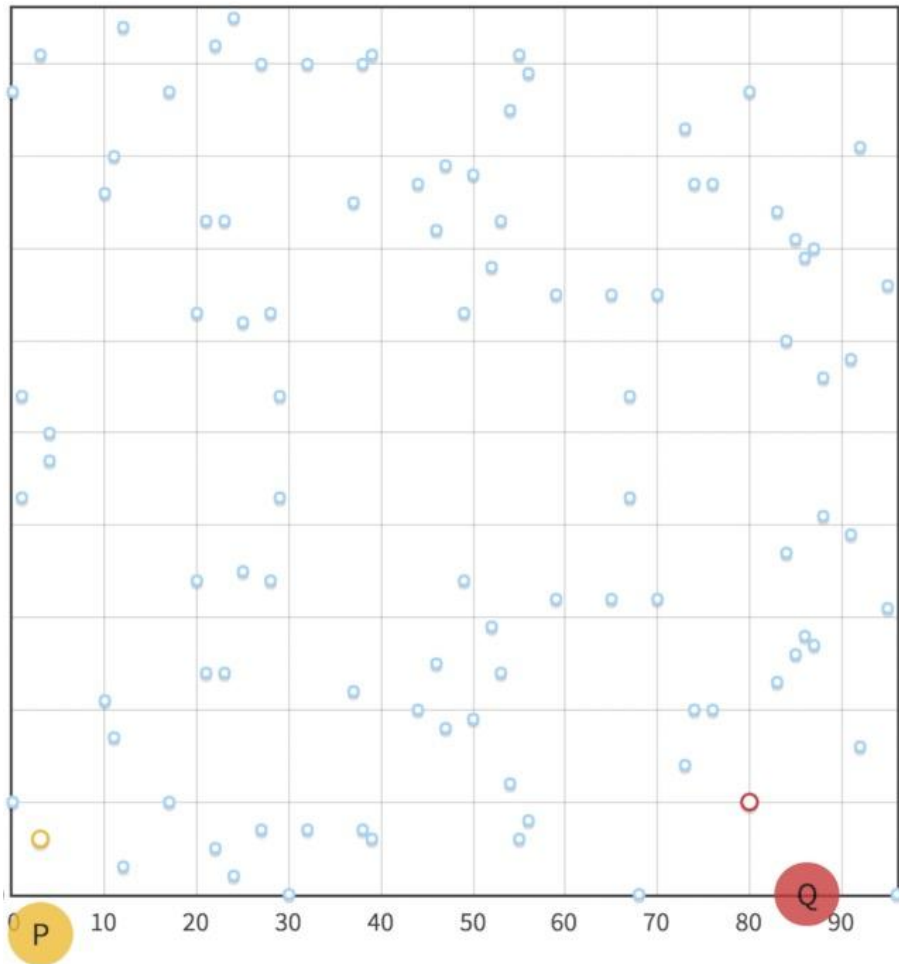
Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 11$**

**Same as  $n = 1, 6$**



Curve: a 2 b 3

Field: p 97

n: n 12

P: x 3 y 6

$Q = n \cdot P$ : x 80 y 10

Scalar multiplication over the elliptic curve  $y^2 = x^3 + 2x + 3$  in  $\mathbb{F}_{97}$ .

The curve has 100 points (including the point at infinity).

The subgroup generated by  $P$  has 5 points.

**$n = 12$**

**Same as  $n = 2, 7$**

... and the pattern continues

# ECC - Groups

$y^2 = x^3 + 2x + 3 \pmod{97}$  on  $P(3, 6)$  we saw a cycle

There are just 5 distinct points:

**0, P, 2P, 3P, 4P**

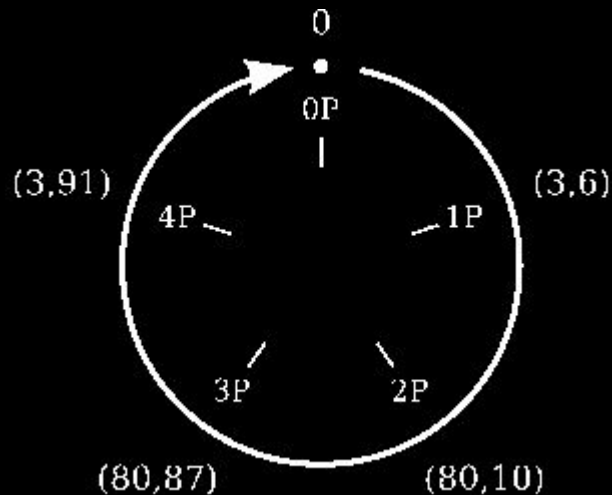
# ECC - Groups

$y^2 = x^3 + 2x + 3 \pmod{97}$  on  $P(3, 6)$  we saw a cycle

There are just 5 distinct points:

**0, P, 2P, 3P, 4P**

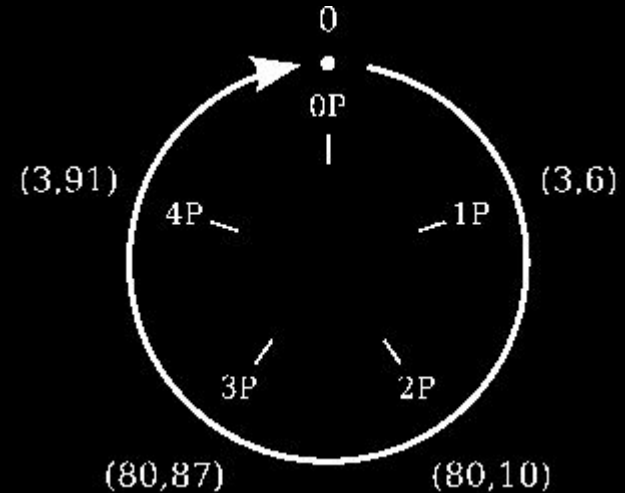
These five points are closed under addition.  
However you add 0, P, 2P, 3P or 4P, the result  
is always one of these five points.



# ECC - Groups

The point  $P(3, 6)$  on  $y^2 = x^3 + 2x + 3 \pmod{97}$  is therefore said to be a **generator** or **base point** of the cyclic subgroup

and the **order** of this subgroup is therefore 5  
(the smallest  $n$  such that  $nP=0$ )



# ECC - Groups

$Q = nP \bmod p$  : easy to calculate

$n = P/Q \bmod p$  : discrete logarithm problem

If you choose your curve, parameters, and generator point carefully, finding  $n$  becomes very very very hard

And this is exactly how the **ECDSA** signature scheme works



# ECDSA

ECDSA signature (used in Bitcoin, Ethereum, etc):

1. **private key** random integer **d** from  $\{1, \dots, n-1\}$  where  $n$  is the order of the subgroup
2. **public key** where  $G$  is the base point **H** = **dG**

# ECDSA

A Bitcoin private key is 256 bits and gives 128-bit security level

To achieve the same security with RSA you would need **3092** bit length key

# Pedersen Commitments

Tool for Confidential Transaction: Pedersen Commitment

Used in privacy coin Grin



[Learn more about how Grin works](#)

# Pedersen Commitments

You could use  $Q = vG$  to “hash” or hide amounts per tx

But that's susceptible to ‘Rainbow table’ attacks as one could precompute popular amount denominations

# Pedersen Commitments

You could use  $Q = vG$  to “hash” or hide amounts per tx

But that's susceptible to ‘Rainbow table’ attacks as one could precompute popular amount denominations

Solution: add a blinding factor

$$\text{Com}(v) = vG + bH$$

# Pedersen Commitments

You could use  $Q = vG$  to “hash” or hide amounts per tx

But that's susceptible to 'Rainbow table' attacks as one could precompute popular amount denominations

Solution: add a blinding factor

$$\text{Com}(v) = vG + bH$$

Where  $G$  and  $H$  are generator points

$b$  is random number used as a **blinding factor**

# Pedersen Commitments

The cool property of Pedersen Commitments (or sometimes called hashes) is that you can add them to check equality

$$\text{Com}(\mathbf{v1}) = \mathbf{v1G} + \mathbf{b1H}$$

$$\text{Com}(\mathbf{v2}) = \mathbf{v2G} + \mathbf{b2H}$$

Such that:

$$\mathbf{v2G} + \mathbf{b2H} + \mathbf{v1G} + \mathbf{b1H} = \mathbf{G(v2 + v1)} + \mathbf{H(b1 + b2)}$$

# Bulletproofs (Range Proofs)

Proving that a number is within a range

$$v \in [0, 2^n)$$

***Zero Knowledge about the Inner Product of Two Vectors***

[Learn more how Bulletproofs work](#)



# Bulletproofs (Range Proofs)

Any number can be represented as inner product of two vectors.

$$5 = \langle [1, 0, 1], [2^2, 2^1, 2^0] \rangle$$

5 equals inner product of 2 vectors  $[1, 0, 1]$  and  $[2^2, 2^1, 2^0]$

# Bulletproofs (Range Proofs)

This is also how binary works

$$101_{\text{binary}} = 5_{\text{decimal}} \text{ since } 1(2^2) + 0(2^1) + 1(2^0)$$

# Bulletproofs (Range Proofs)

$$v = \langle a, 2^n \rangle$$

Example:

$v = 5$  and we wanted to prove that 5 is in range of 0 to  $2^n$   
without showing 5

$$v \in [0, 2^n)$$

# Bulletproofs (Range Proofs)

$$5_{\text{decimal}} = 101_{\text{binary}} = 1(2^2) + 0(2^1) + 1(2^0)$$

Need at least 3 bits to represent 5: **n has to be at least 3**

$$2^3 = 8$$

Therefore it's clear that 5 must be in range of 0 to  $2^n$

# Bulletproofs (Range Proofs)

$$\mathbf{v} = \langle \mathbf{a}, 2^n \rangle$$

We need to prove that:

- 1) That assignment of  $\mathbf{a}$  is correct
- 2) We can commit to secret values using Pedersen commitments and prove we know the value using a technique similar to **Fiat-Shamir**

required relation

$$v \in [0, 2^n)$$

value  $v$  must fit  
in a given range

statement about bits

$$\begin{aligned} \langle \mathbf{a}_L, \mathbf{2}^n \rangle &= v \\ \mathbf{a}_L \odot \mathbf{a}_R &= \mathbf{0} \\ (\mathbf{a}_L - \mathbf{1}) - \mathbf{a}_R &= \mathbf{0} \end{aligned}$$

$v$  must have exactly  $2^n$  bits;  
each bit must be either 0 or 1

combining statements + blinding factors

$$\begin{aligned} \mathbf{l}(x) &= (\mathbf{a}_L + \mathbf{s}_L x) - z\mathbf{1} \\ \mathbf{r}(x) &= \mathbf{y}^n \odot ((\mathbf{a}_R + \mathbf{s}_R x) + z\mathbf{1}) + z^2 \mathbf{2}^n \\ t(x) &= \langle \mathbf{l}(x), \mathbf{r}(x) \rangle = t_0 + t_1 x + t_2 x^2 \\ t(0) &= z^2 v + \delta(y, z) \end{aligned}$$

challenge  $\mathbf{y}$  combines  
inner statements about bits

challenge  $\mathbf{z}$  combines  
three outer statements

challenge  $\mathbf{x}$  separates  
values from blinding factors

mapping  $\mathbf{t}(x)$  to Pedersen commitments

$$\begin{aligned} \underline{t(x)}B &= z^2 vB + \delta(y, z)B + x t_1 B + x^2 t_2 B \\ + &+ + + + \\ \tilde{t(x)}\tilde{B} &= z^2 \tilde{v}\tilde{B} + 0\tilde{B} + x \tilde{t}_1 \tilde{B} + x^2 \tilde{t}_2 \tilde{B} \\ || &|| || || || \\ &= z^2 V + \delta(y, z)B + x T_1 + x^2 T_2 \end{aligned}$$

polynomial evaluation  $\mathbf{t}(x)$  must have a required structure  
in terms of value commitment  $V$  and challenges  $x, y, z$ .

$$c \xleftarrow{\$} \mathbb{Z}_p$$

combine two statements in one  
with a random factor

mapping vectors  $\mathbf{l}(x), \mathbf{r}(x)$  to vector Pedersen commitments

$$\begin{aligned} \langle \underline{\mathbf{l}(x)}, \mathbf{G} \rangle &= \langle \mathbf{a}_L, \mathbf{G} \rangle + x \langle \mathbf{s}_L, \mathbf{G} \rangle + \langle -z\mathbf{1}, \mathbf{G} \rangle \\ + &+ + + \\ \langle \underline{\mathbf{r}(x)}, \mathbf{H}' \rangle &= \langle \mathbf{a}_R, \mathbf{H} \rangle + x \langle \mathbf{s}_R, \mathbf{H} \rangle + \langle z\mathbf{y}^n + z^2 \mathbf{2}^n, \mathbf{H}' \rangle \\ + &+ + + \\ \tilde{e}\tilde{B} &= \tilde{a}\tilde{B} + x \tilde{s}\tilde{B} \\ || &|| || || \\ &= A + xS + \langle z\mathbf{y}^n + z^2 \mathbf{2}^n, \mathbf{H}' \rangle - z \langle \mathbf{1}, \mathbf{G} \rangle \end{aligned}$$

vector polynomial evaluations  $\mathbf{l}(x)$  and  $\mathbf{r}(x)$  must have a required structure  
in terms of vector commitments  $A$  and  $S$  and challenges  $x, y, z$ .

$$0 \stackrel{?}{=} 1 \cdot A$$

$$+ x \cdot S$$

$$+ \underline{c} z^2 \cdot V$$

$$+ \underline{c} x \cdot T_1$$

$$+ \underline{c} x^2 \cdot T_2$$

$$+ \left( w(t(x) - \underline{a}b) + \underline{c}(\delta(y, z) - t(x)) \right) \cdot B$$

$$+ (-\tilde{e} - \underline{c}\tilde{t}(x)) \cdot \tilde{B}$$

$$+ \langle -z\mathbf{1} - \underline{a}\mathbf{s}, \mathbf{G} \rangle$$

$$+ \langle z\mathbf{1} + \mathbf{y}^{-n} \odot (z^2 \mathbf{2}^n - \underline{b}/\underline{s}), \mathbf{H} \rangle$$

$$+ \langle [\underline{u}_1^2, \dots, \underline{u}_k^2], [\underline{L}_1, \dots, \underline{L}_k] \rangle$$

$$+ \langle [\underline{u}_1^{-2}, \dots, \underline{u}_k^{-2}], [\underline{R}_1, \dots, \underline{R}_k] \rangle$$

final verification check  
with multi-scalar  
multiplication

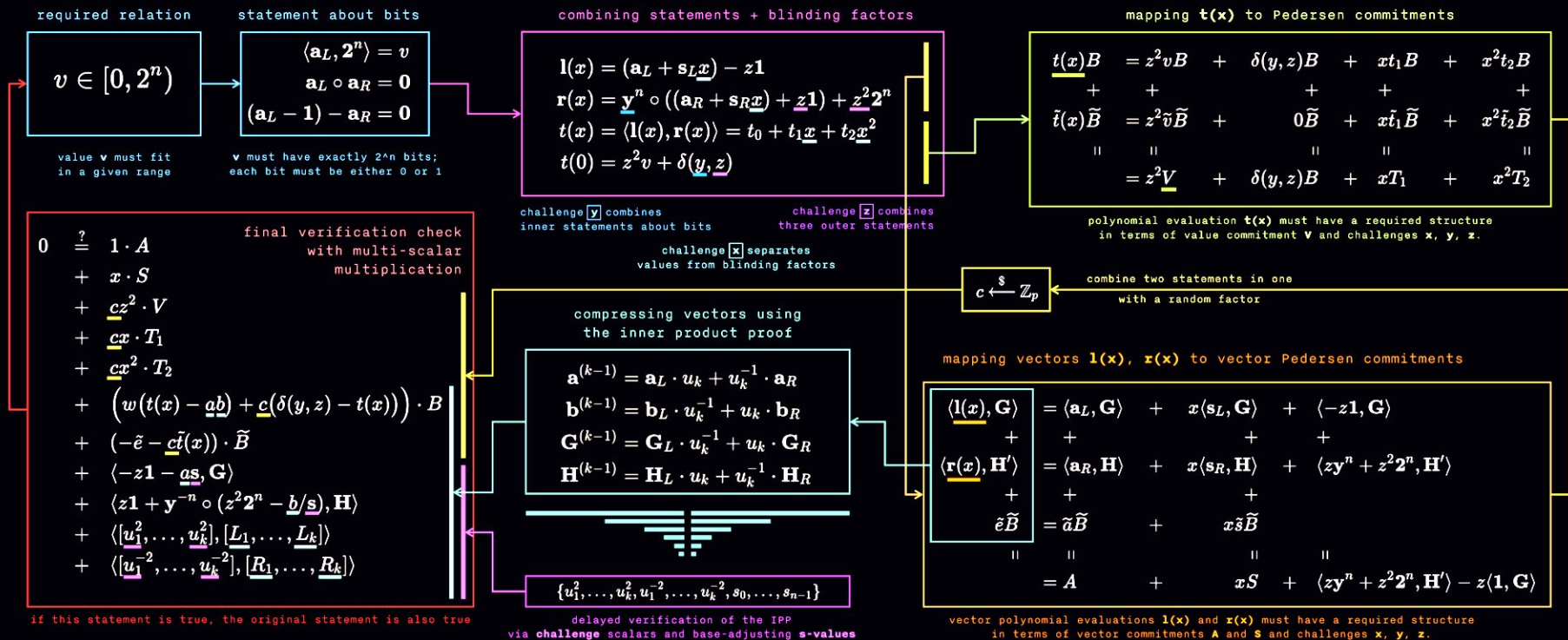
compressing vectors using  
the inner product proof

$$\begin{aligned} \mathbf{a}^{(k-1)} &= \mathbf{a}_L \cdot u_k + u_k^{-1} \cdot \mathbf{a}_R \\ \mathbf{b}^{(k-1)} &= \mathbf{b}_L \cdot u_k^{-1} + u_k \cdot \mathbf{b}_R \\ \mathbf{G}^{(k-1)} &= \mathbf{G}_L \cdot u_k^{-1} + u_k \cdot \mathbf{G}_R \\ \mathbf{H}^{(k-1)} &= \mathbf{H}_L \cdot u_k + u_k^{-1} \cdot \mathbf{H}_R \end{aligned}$$

$$\{u_1^2, \dots, u_k^2, u_1^{-2}, \dots, u_k^{-2}, s_0, \dots, s_{n-1}\}$$

delayed verification of the IPP  
via challenge scalars and base-adjusting  $s$ -values

if this statement is true, the original statement is also true



[Learn more how Bulletproofs work](#)

# STARKs

Please refer to Remco from 0x for all your STARK questions :)



# SNARKs

There are *many* (50+) variants of SNARKs

**QAP variant (quadratic arithmetic program):**

Computation  $\rightarrow$  Arithmetic Circuit  $\rightarrow$  R1CS  $\rightarrow$  QAP  $\rightarrow$  SNARK

Check out this [excellent primer by Decentriq](#)  
And [Zcash's explainer](#)

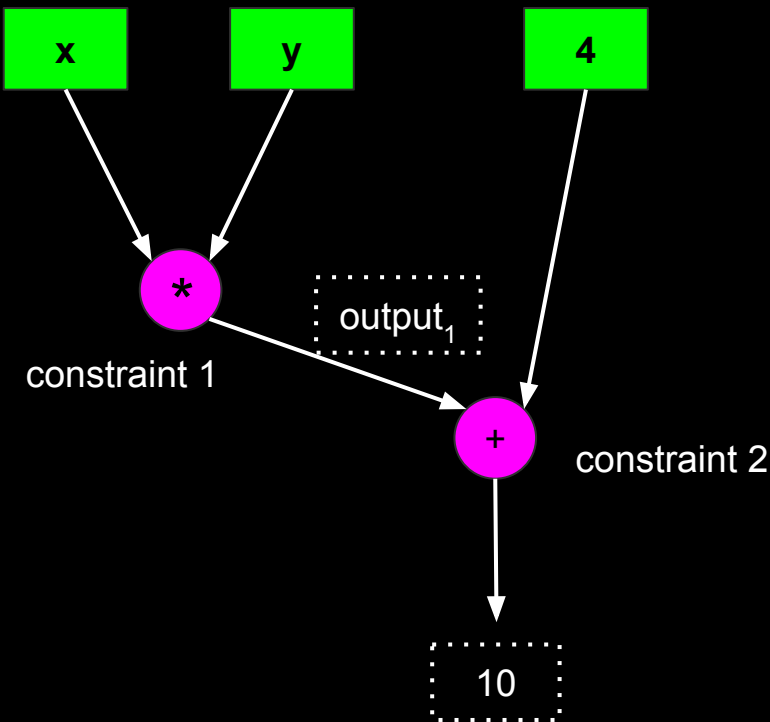
# SNARKs - Computation

$$x * y + 4 = 10$$

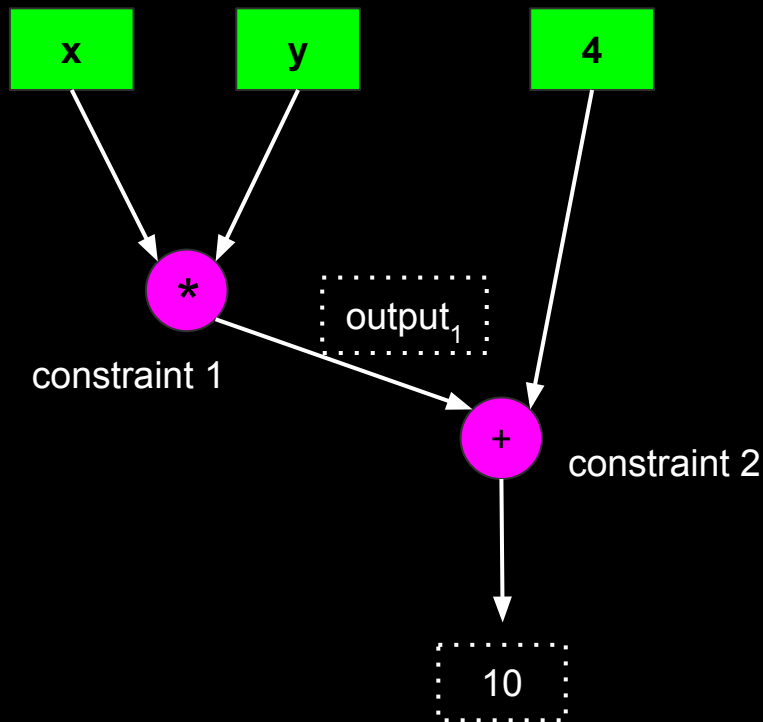
Prover wants to prove that they know values **x** and **y**

# SNARKs - Arithmetic Circuit

$$x * y + 4 = 10$$



# SNARKs - Arithmetic Circuit

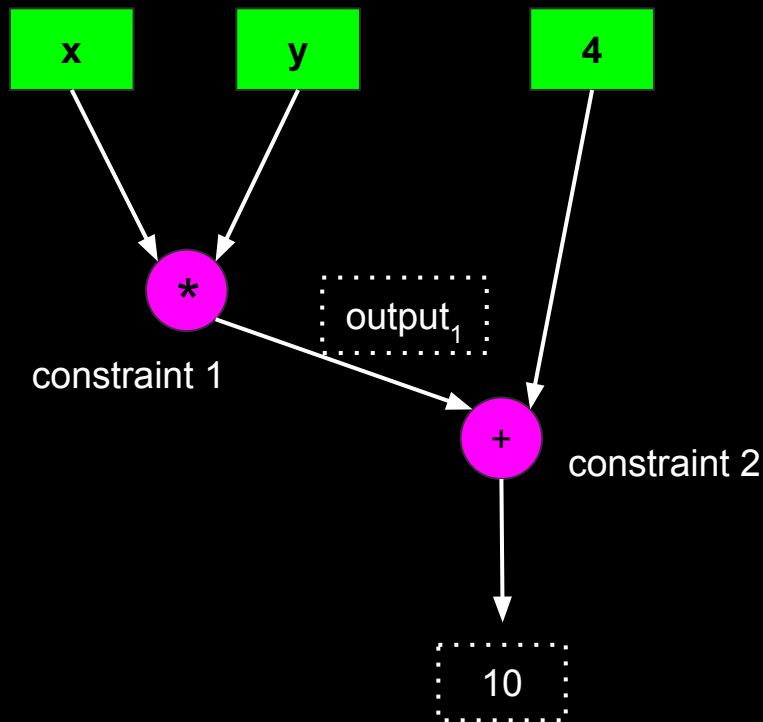


Constraint 1:  
 $\text{output}_1 = x * y$

Constraint 2:  
 $\text{output}_1 + 4 = 10$

*Constraint 3:*  
*Equality constraint*

# SNARKs - R1CS



Constraint has a left input, right input and output

Such that:

$$\text{left}(L) * \text{right}(R) = \text{output}(O)$$

With 3 vectors:

$$\langle L, v \rangle * \langle R, v \rangle = \langle O, v \rangle$$

$v$  is the variable vector

$$v = [1, x, y, output_1]$$

# SNARKs - Arithmetic Circuit

$$\langle \mathbf{L}, \mathbf{v} \rangle * \langle \mathbf{R}, \mathbf{v} \rangle = \langle \mathbf{O}, \mathbf{v} \rangle$$

$$\mathbf{v} = [1, x, y, \text{output}_1]$$

**Constraint 1:**  $x * y = \text{output}_1$

$$\mathbf{L} = [0, 1, 0, 0] \text{ // } x$$

$$\mathbf{R} = [0, 0, 1, 0] \text{ // } y$$

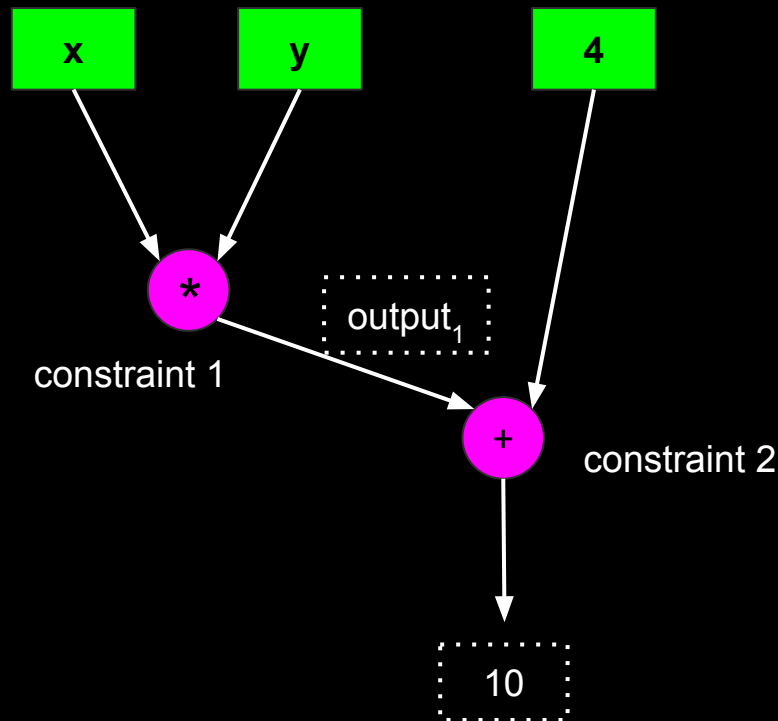
$$\mathbf{O} = [0, 0, 0, 1] \text{ // } \text{output}_1$$

**Constraint 2:**  $(\text{output}_1 + 4) * 1 = 10$

$$\mathbf{L} = [4, 0, 0, 1] \text{ // } \text{output}_1 + 5$$

$$\mathbf{R} = [1, 0, 0, 0] \text{ // } 1$$

$$\mathbf{O} = [10, 0, 0, 0] \text{ // } 10$$



# SNARKs - QAP

Create polynomials for each constraint using *Lagrange interpolation*

$$\mathbf{L} * \mathbf{R} = \mathbf{O}$$

**Constraint 1:**

$$\mathbf{L} = [0, 1, 0, 0] \text{ // } x$$

$$\mathbf{R} = [0, 0, 1, 0] \text{ // } y$$

$$\mathbf{O} = [0, 0, 0, 1] \text{ // output}_1$$

**Constraint 2:**

$$\mathbf{L} = [4, 0, 0, 1] \text{ // output}_1 + 5$$

$$\mathbf{R} = [1, 0, 0, 0] \text{ // } 1$$

$$\mathbf{O} = [10, 0, 0, 0] \text{ // } 10$$

$$\begin{aligned} L_1[1] &= 0 \text{ (look at 1st constraint, 1st element of L)} \\ L_1[2] &= 4 \text{ (look at 2nd constraint, 1st element of L)} \end{aligned}$$

2 points: (1, 0) and (2, 4). We can use Lagrange interpolation to get a polynomial:  $4x - 4$

$$L_1(x) = 4x - 4$$

**And we do this for each constraint, for each variable**

$$L_i(x), R_i(x), O_i(x)$$

# SNARKs - QAP

$$\mathbf{L} * \mathbf{R} = \mathbf{O}$$

**Constraint 1:**

$$\mathbf{L} = [0, 1, 0, 0] \text{ // } x$$

$$\mathbf{R} = [0, 0, 1, 0] \text{ // } y$$

$$\mathbf{O} = [0, 0, 0, 1] \text{ // output}_1$$

**Constraint 2:**

$$\mathbf{L} = [4, 0, 0, 1] \text{ // output}_1 + 5$$

$$\mathbf{R} = [1, 0, 0, 0] \text{ // } 1$$

$$\mathbf{O} = [10, 0, 0, 0] \text{ // } 10$$

$$L_1(x) = 4x - 4$$

$$L_2(x) = -1x + 2$$

$$L_3(x) = 0$$

$$L_4(x) = 1x - 1$$



# SNARKs - QAP

$L(x) * R(x) = O(x)$  for  $x$  in  $\{1, 2\}$  (since we have 2 constraints)

# SNARKs - QAP

$L(x) * R(x) = O(x)$  for  $x$  in  $\{1, 2\}$  (since we have 2 constraints)

$$P = L(x) * R(x) - O(x)$$

# SNARKs - QAP

$L(x) * R(x) = O(x)$  for  $x$  in  $\{1, 2\}$  (since we have 2 constraints)

$$P = L(x) * R(x) - O(x) = T(x) * H(x)$$

$T(x)$  is a publicly known evaluation used for Verification

# SNARKs - QAP

$L(x) * R(x) = O(x)$  for  $x$  in  $\{1, 2\}$  (since we have 2 constraints)

$$P = L(x) * R(x) - O(x) = T(x) * H(x)$$

$T(x)$  is a publicly known evaluation used for Verification

$H(x)$  is provided by the Prover and divides  
 $L(x) * R(x) - O(x)$  evenly (without remainder)

# SNARKs - QAP

$$L(x) * R(x) - O(x) = T(x) * H(x)$$

The Prover would send evaluations of  $x$  for  $L$ ,  $R$ ,  $O$ , and  $H$  polynomials

But how would we ensure that:

- 1) This “ $x$ ” is hidden
- 2) Prover actually uses its polynomials

# SNARKs - QAP

$$L(s) * R(s) - O(s) = T(s) * H(s)$$

$s$  is a linear combination of  $(g, s \cdot g, \dots, s^d \cdot g)$  of length  $d$   
(which corresponds to the max degrees of these polynomials)

This achieves two things:

- 1) We're forcing the Prover to evaluate  $s$  on its polynomials
- 2) This  $s$  is **encrypted**, or “hidden”

# SNARKs

**How can we evaluate a value that is encrypted?**

**Ex: Instead of sending  $s$  plaintext, we can send  $E(s)$**

$$E(s) = sG$$

*(where  $G$  is a generator point on a elliptic curve)*

# SNARKs

**We can still do evaluations of  $E(s)$ , even though it's encrypted (sometimes called homomorphic addition):**

**Example:**

$$E(3) + E(4) = E(3 + 4) = E(7)$$



# SNARKs

$$L(s) * R(s) - O(s) = T(s) * H(s)$$

Using encrypted  $s$ , the Prover would send back:

$E(L(s))$ ,  $E(R(s))$ ,  $E(O(s))$ ,  $E(H(s))$ ,

# SNARKs

$$L(s) * R(s) - O(s) = T(s) * H(s)$$

Using encrypted  $s$ , the Prover would send back:

$$E(L(s)), E(R(s)), E(O(s)), E(H(s)),$$

But we still don't have *zero-knowledge* as some information about the assignment is leaked

# SNARKs

$$L(s) * R(s) - O(s) = T(s) * H(s)$$

**Adding zero-knowledge:**

**The Prover simply adds a form of a blinding factor to the  
L, R, O evaluations**

# SNARKs - Protocol

1. **Setup**:  $E(s)$  is known to everyone,  $T(s)$  is known to everyone ( **$s$  itself is thrown away, “toxic waste”**)
2. Prover has **L**, **R**,  $O$  and **H** polynomials
3. Prover sends  $E(\text{L}(s))$ ,  $E(\text{R}(s))$ ,  $E(O(s))$ ,  $E(\text{H}(s))$
4. Anyone in the network can verify:  
$$E(\text{L}(s)) * E(\text{R}(s)) - E(O(s)) = E(\text{H}(s)) * E(\text{T}(s))$$

# SNARKs - what's left

1. This is a huge oversimplification, and we skipped some details regarding “blinding factors”
2. Pairing of Elliptic Curves for the Verifier
3. This went over the Pinocchio Protocol (**PGHR**) 2013  
Better proving systems already out there: **Groth16**

# SNARKs - the Future

1. Enormous effort in research for further optimization
  - a. Research in pairings
  - b. Research in optionality of elliptic curves
  - c. Lattice-based SNARKs
  - d. And a lot, lot more

Let's Go Ahead and  
Build One!

# Part 2:

# Zokrates