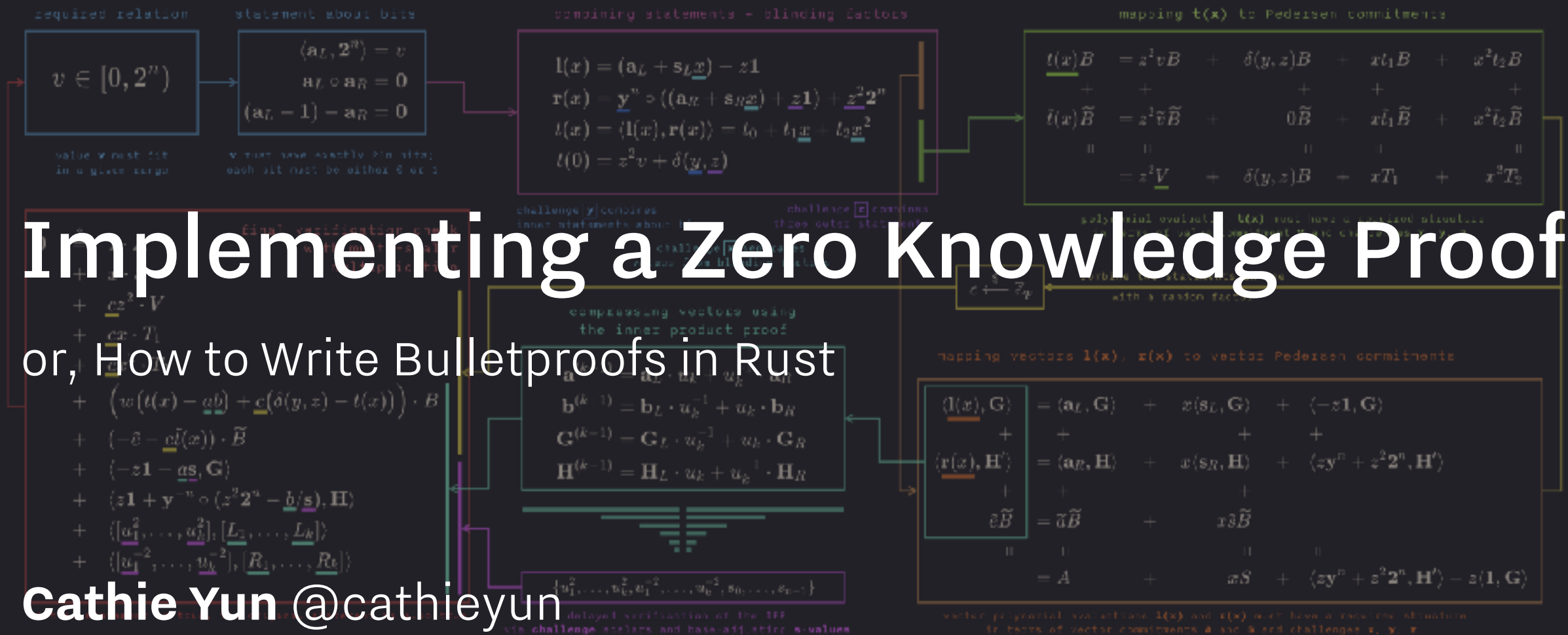


Implementing a Zero Knowledge Proof

or, How to Write Bulletproofs in Rust

Cathie Yun @cathieyun

Crypto Village - DEFCON 2019



The story

- 1 Motivation
- 2 Understanding the paper
- 3 Tools of the trade

The code

- 4 Range proof
- 5 Rust tricks
- 6 Above and beyond

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Why do we care about
zero knowledge proofs?

Non-confidential transaction

INPUTS	OUTPUTS
5	3
4	6

$$5 + 4 = 3 + 6$$

Confidential transaction (broken)

INPUTS	OUTPUTS
A = Com(5)	C = Com(3)
B = Com(4)	D = Com(6)

Additively
homomorphic
commitment

$$A + B = C + D$$

Confidential transaction (broken)

INPUTS

A = Com(5)
B = Com(4)

OUTPUTS

C = Com(-1)
D = Com(10)

OH NO!!!
integer underflow!

$$A + B = C + D$$

Confidential transaction

INPUTS

$A = \text{Com}(5)$
$B = \text{Com}(4)$

OUTPUTS

$C = \text{Com}(3) \text{ proof}_{(C)}$
$D = \text{Com}(6) \text{ proof}_{(D)}$

$$A + B = C + D$$

ZK proof that
amount is in range

Why do we care about
Bulletproofs?

Blockchains & Bulletproofs

Blockchain requirement

Constrained proof size

(all nodes must receive and verify proofs)

Fast verification

(low latency - all verifiers must sync quickly)

Ad hoc logic

(different value flows,
custom smart contracts)

Bulletproofs provide

$O(\log(N))$ proof sizes,
less than **1 Kb** for most cases.

Fast verification with **Ristretto** and **AVX2**;
scales well via **batching** and **aggregation**.

No trusted setup -
cheap on-the-fly initialization of verification circuit

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How to draw an owl

1.



2.



1. Draw some circles

2. Draw the rest of the fucking owl

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

(1)

let \vec{a} be the bits of v

$$(2) \langle \vec{a}, \vec{2}^n \rangle = v \quad \left\{ \begin{array}{l} \Leftrightarrow (1) \end{array} \right.$$

$$(3) \vec{a} \cdot (\vec{a} - \vec{1}^n) = \vec{0}^n$$

Since $\vec{a} \cdot (\vec{a} - \vec{1}^n) = \vec{0} \Leftrightarrow \forall y \in \mathbb{Z}_p, \langle \vec{a}, (\vec{a} - \vec{1}^n) \cdot \vec{y}^n \rangle = 0$

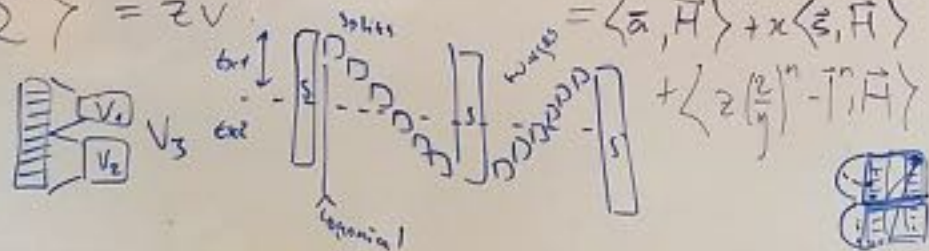
$$\text{we have } (4) \langle \vec{a}, \vec{y}^n \cdot (\vec{a} - \vec{1}^n) \rangle = 0 \xrightarrow{\text{proof}} (3)$$

for verifier's choice of y .

$$(5) z \langle \vec{a}, \vec{2}^n \rangle + \langle \vec{a}, \vec{y}^n \cdot (\vec{a} - \vec{1}^n) \rangle = zv$$

Proof: rearrange to get consistent data in

$$(6) \langle \vec{a}, \vec{y}^n \cdot (\vec{a} - \vec{1}^n) + z \vec{2}^n \rangle = zv$$



As in the paper, want to blind the v values.

Prover selects $\vec{s} \leftarrow \mathbb{Z}_p^n$

$$\vec{l}(x) = \vec{a} + x\vec{s}$$

$$\vec{r}(x) = \vec{y}^n \cdot (\vec{l}(x) - \vec{1}^n) + z \vec{2}^n$$

$$\text{Set } t(x) = \langle \vec{l}(x), \vec{r}(x) \rangle = t_0 + t_1 x + t_2 x^2$$

$$= \langle \vec{a}, \vec{y}^n \cdot (\vec{a} - \vec{1}^n) + z \vec{2}^n \rangle$$

$$+ \langle \vec{s}, \vec{y}^n \cdot (\vec{a} - \vec{1}^n) + z \vec{2}^n \rangle + \langle \vec{a}, \vec{y}^n \cdot \vec{s} \rangle x$$

$$+ \langle \vec{s}, \vec{y}^n \cdot \vec{s} \rangle x^2$$

$$\langle \vec{l}(x), \vec{r}(x) \rangle = \langle \vec{a}, \vec{r}(x) \rangle + x \langle \vec{s}, \vec{r}(x) \rangle$$

$$\text{Set } \vec{H}' = \vec{y}^n \cdot \vec{H} \quad (\text{lazy eval})$$

$$\langle \vec{r}(x), \vec{H}' \rangle = \langle \vec{y}^n \cdot (\vec{a} + x\vec{s} - \vec{1}^n) + z \vec{2}^n, \vec{H}' \cdot \vec{y}^n \rangle$$

$$= \langle \vec{a} + x\vec{s} - \vec{1}^n + z \left(\frac{\vec{2}}{y}\right)^n, \vec{H}' \rangle$$

$$= \langle \vec{a}, \vec{H}' \rangle + x \langle \vec{s}, \vec{H}' \rangle$$

$$+ \langle z \left(\frac{\vec{2}}{y}\right)^n - \vec{1}^n, \vec{H}' \rangle$$

$$t(x)B = z v B + x t_1 B + x^2 t_2 B$$

$$+ + + + +$$

$$\vec{l}(x) \vec{r}(x) = z \vec{v} \vec{B} + x \vec{t}_1 \vec{B} + x^2 \vec{t}_2 \vec{B}$$

$$\parallel \parallel \parallel \parallel \parallel$$

$$t(x)B + \vec{l}(x) \vec{r}(x) = z V + x T_1 + x^2 T_2$$

$$\parallel \parallel \parallel \parallel \parallel$$

$$= z \text{Com}(v) + x \text{Com}(t_1) + x^2 \text{Com}(t_2)$$

$$\langle \vec{l}(x), \vec{G} \rangle = \langle \vec{a}, \vec{G} \rangle + x \langle \vec{s}, \vec{G} \rangle$$

$$+ \langle \vec{r}(x), \vec{H}' \rangle = \langle \vec{a}, \vec{H}' \rangle + x \langle \vec{s}, \vec{H}' \rangle + \langle z \left(\frac{\vec{2}}{y}\right)^n - \vec{1}^n, \vec{H}' \rangle$$

$$+ \vec{e} \vec{B} = \vec{a} \vec{B} + x \vec{s} \vec{B}$$

$$\parallel \parallel \parallel \parallel \parallel$$

$$P = A + x S + \langle z \left(\frac{\vec{2}}{y}\right)^n - \vec{1}^n, \vec{H}' \rangle$$

$$\text{Com}(\vec{l}(x), \vec{r}(x), z) \quad \text{Com}(\vec{a}, \vec{s}, \vec{H}') \quad x \text{Com}(\vec{s}, \vec{H}')$$

Prover sends $\vec{e}, t(x), \vec{l}(x), \vec{r}(x)$ to verifier.

Verfi: $\vec{r}(x) \leftarrow \vec{y}^n \cdot \vec{H}' \leftarrow (\text{lazy})$, $P \leftarrow \langle \vec{l}(x), \vec{a} \rangle + \langle \vec{r}(x), \vec{H}' \rangle + \vec{e} \vec{B}$

checks & pay: $t(x)B + \vec{l}(x) \vec{r}(x) = zV + xT_1 + x^2T_2$

checks t, r : $P = A + xS + \langle z \left(\frac{\vec{2}}{y}\right)^n - \vec{1}^n, \vec{H}' \rangle$

$$t(x) = \langle \vec{l}(x), \vec{r}(x) \rangle$$

$$= 0$$

$$\langle \vec{z}^{(0)}, \vec{w} \rangle$$

$$\vec{w} = w_0 \vec{e}_0 + w_1 \vec{e}_1 + w_2 \vec{e}_2$$

$$w_0 \cdot x + \vec{a}_0 \cdot x^2$$

$$w_1 \cdot x - \vec{y}^n + z^{(0)}(w_0)$$

$$z^{(0)}(z^{(0)} \cdot w_1), z^{(0)} \cdot w_2$$

$$\in \mathbb{Z}_p^n[x]$$

$$\in \mathbb{Z}_p^n[x]$$

$$f(y, z)$$

$$\mathbb{Z}_p^n[x]$$

$$\langle \vec{a}_0, -\vec{y}^n \rangle + \langle \vec{a}_0, \vec{z}^{(0)} \cdot w_0 \rangle$$

$$= \langle \vec{a}_0, \vec{y}^n - \vec{a}_0 \rangle + \langle \vec{a}_0, \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$\langle \vec{y}^n \cdot \vec{a}_0, \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0) \rangle + \dots$$

$$\langle \vec{a}_0, -\vec{y}^n + \vec{z}^{(0)} \cdot w_0 \rangle \leftarrow +\delta(y, z) - d(y, z)$$

$$= \langle \vec{a}_0 + \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0), \vec{y}^n \cdot \vec{a}_0 \rangle + \dots$$

$$\langle \vec{a}_0, \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$\langle \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0), \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$- \delta(y, z)$$

$$+ \langle \vec{a}_0, -\vec{y}^n + \vec{z}^{(0)} \cdot w_0 \rangle$$

$$= \langle \vec{a}_0 + \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0), \vec{y}^n \cdot \vec{a}_0 \rangle + \dots$$

$$\langle \vec{a}_0 + \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0), \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$- \delta(y, z) + \langle \vec{a}_0, -\vec{y}^n + \vec{z}^{(0)} \cdot w_0 \rangle$$

$$= \langle \vec{a}_0 + \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0), \vec{y}^n \cdot \vec{a}_0 + \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$- \delta(y, z) + \langle \vec{a}_0, -\vec{y}^n + \vec{z}^{(0)} \cdot w_0 \rangle \cdot x^2$$

BLINDING inner product:

$$\vec{a}_0 \rightarrow \vec{a}_0 \cdot x + \vec{a}_1 \cdot x^2 \quad \vec{a}_0 \rightarrow \vec{a}_0 \cdot x \quad w_0 \rightarrow w_0 \cdot x$$

$$\vec{a}_1 \rightarrow \vec{a}_1 \cdot x + \vec{a}_2 \cdot x^2 \quad w_1 \rightarrow w_1 \cdot x \quad w_2 \rightarrow w_2 \cdot x$$

$$\langle \vec{z}^{(0)}, \vec{z} + w_0 \cdot \vec{v} \rangle = \langle (\vec{a}_0 \cdot x + \vec{a}_1 \cdot x^2) + \vec{y}^n \cdot (\vec{z}^{(0)} \cdot w_0 \cdot x), \dots \rangle$$

$$\vec{y}^n \cdot (\vec{a}_0 \cdot x + \vec{a}_1 \cdot x^2) + \vec{z}^{(0)} \cdot w_0 \cdot x + \dots$$

$$\langle \vec{a}_0 \cdot x^2, -\vec{y}^n + \vec{z}^{(0)} \cdot w_0 \rangle + \dots$$

$$- \delta(y, z)$$

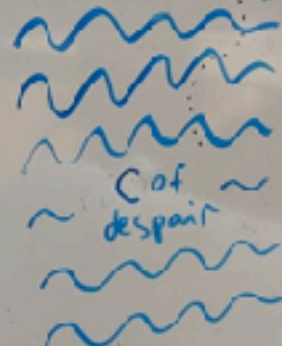
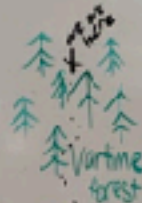
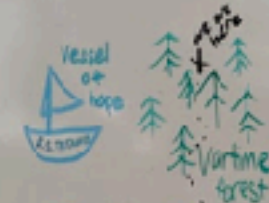
← how come variable definitions in d(y,z) don't change?

↑ maybe they do! f(x^2)

$$\begin{matrix} x & x \\ \langle a, b \rangle & + \langle c, d \rangle \end{matrix} \neq \langle a+c, b+d \rangle$$

$$= \text{2nd degree: } (a \cdot x + c \cdot x^2; b \cdot x + d \cdot x^2) \leftarrow$$

$$\underline{\langle a, b \rangle x^2 + \langle c, d \rangle x^2 +}$$



NO COAS

Proving range statements with bit vectors

Let \mathbf{a} be the vector of bits of v . Then v can be represented as an inner product of bits \mathbf{a} and powers of two $\mathbf{2}^n = (1, 2, 4, \dots, 2^{n-1})$:

$$\begin{aligned} v &= \langle \mathbf{a}, \mathbf{2}^n \rangle \\ &= a_0 \cdot 2^0 + \dots + a_{n-1} \cdot 2^{n-1}. \end{aligned}$$

We need \mathbf{a} to be a vector of integers $\{0, 1\}$. This can be expressed with an additional condition

$$\mathbf{a} \circ (\mathbf{a} - \mathbf{1}) = \mathbf{0},$$

where $\mathbf{x} \circ \mathbf{y}$ denotes the entry-wise multiplication of two vectors. The result of multiplication can be all-zero if and only if every bit is actually 0 or¹ 1.

As a result of representing value in binary, the range condition $v \in [0, 2^n)$ is equivalent to the pair of conditions

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

We will eventually need to make separate commitments to the vectors \mathbf{a} and $\mathbf{a} - \mathbf{1}$, so we set $\mathbf{a}_L = \mathbf{a}$, $\mathbf{a}_R = \mathbf{a} - \mathbf{1}$ to obtain

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

Bulletproof building block: inner products

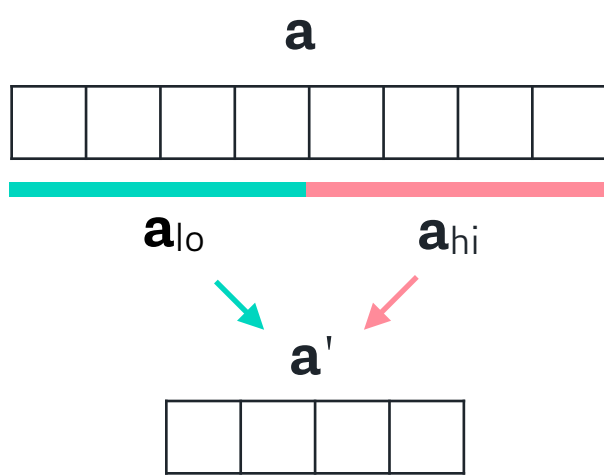
$$c = \langle \mathbf{a}, \mathbf{b} \rangle$$

$$\boxed{c} = \sum \begin{array}{c} \mathbf{a} \\ \mathbf{b} \end{array} \begin{array}{|c|c|c|c|c|} \hline a_0 & a_1 & a_2 & \dots & a_{n-1} \\ \hline \end{array} \begin{array}{|c|c|c|c|c|} \hline b_0 & b_1 & b_2 & \dots & b_{n-1} \\ \hline \end{array}$$

The diagram illustrates the inner product calculation. A box containing 'c' is followed by an equals sign and a large summation symbol. To the right of the summation symbol are two rows of boxes. The top row is labeled 'a' and contains boxes for a_0 , a_1 , a_2 , an ellipsis, and a_{n-1} . The bottom row is labeled 'b' and contains boxes for b_0 , b_1 , b_2 , an ellipsis, and b_{n-1} . Below the 'a' row, there are 'x' marks under a_0 , a_1 , a_2 , and a_{n-1} , indicating the multiplication of corresponding elements.

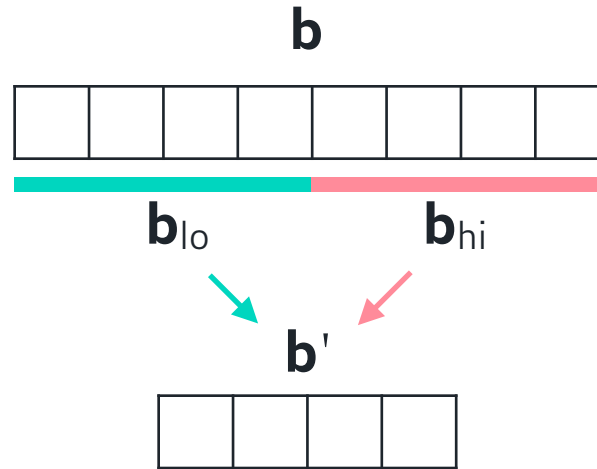
We can make a proof that $c = \langle \mathbf{a}, \mathbf{b} \rangle$
in size and $O(\log(n))$ instead of $O(n)$.

Prover gets random challenge scalar x from verifier



$$\mathbf{a}' = \mathbf{a}_{lo} \cdot X + \mathbf{a}_{hi} \cdot X^{-1}$$

...



$$\mathbf{b}' = \mathbf{b}_{lo} \cdot X^{-1} + \mathbf{b}_{hi} \cdot X$$

...

$$\mathbf{c} = \langle \mathbf{a}, \mathbf{b} \rangle$$



$$\mathbf{c}' = \langle \mathbf{a}', \mathbf{b}' \rangle$$



$$\mathbf{c}' = \langle \mathbf{a}_{lo} \cdot X + \mathbf{a}_{hi} \cdot X^{-1}, \mathbf{b}_{lo} \cdot X^{-1} + \mathbf{b}_{hi} \cdot X \rangle$$

The proof size is $O(\log(n))$ instead of $O(n)$.

Bulletproof range proofs

How do we express a range as an inner product?

$$0 \leq v < 2^n \rightarrow \begin{array}{c} \text{apply} \\ \text{math \&} \\ \text{crypto} \end{array} \rightarrow c = \langle \mathbf{a}, \mathbf{b} \rangle$$

Range statement \rightarrow inner product

We want to prove:

$$0 \leq v < 2^n$$

If this is true, then v must be a binary number of length n .

$$v = \sum \begin{array}{|c|c|c|c|} \hline 0 & 1 & 1 & 1 \\ \hline \end{array} \times \begin{array}{|c|c|c|c|} \hline 2^3 & 2^2 & 2^1 & 2^0 \\ \hline \end{array}$$

If $v=7$, $n=4$

Range statement \rightarrow inner product

We want to prove:

$$0 \leq v < 2^n$$

If this is true, then v must be a binary number of length n .

$$v = \sum \begin{array}{|c|c|c|c|} \hline 0 & 1 & 1 & 1 \\ \hline \end{array} \times \begin{array}{|c|c|c|c|} \hline 2^3 & 2^2 & 2^1 & 2^0 \\ \hline \end{array}$$

Let's call this \mathbf{a}_L

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

Range statement \rightarrow inner product

We want to prove:

$$0 \leq v < 2^n$$

We can do this by proving:

$$1) v = \langle \mathbf{a}_L, \mathbf{2}^n \rangle$$

 binary structure of v

$$2) \mathbf{a}_L \circ (\mathbf{a}_L - \mathbf{1}^n) = \mathbf{0}^n$$

 bits are actually bits (0s or 1s)

Range statement \rightarrow inner product

$$0 \leq v < 2^n$$



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

$$\mathbf{a}_L \circ (\mathbf{a}_L - \mathbf{1}^n) = \mathbf{0}^n$$



Add blinding factors
Combine statements



$$c = \langle \mathbf{a}, \mathbf{b} \rangle$$

Want more details?

I'm giving a "Bulletproofs deep dive" talk at DEFCON too!

Sunday 8/11 at 11:45am at Monero Village

The Bulletproofs paper:

<https://eprint.iacr.org/2017/1066.pdf>

Our notes on the Bulletproofs math:

<https://doc-internal.dalek.rs/bulletproofs/notes/index.html>

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We need to build:

- Prime order group
- Fiat-Shamir heuristic

Bulletproofs requires a prime-order group

2.4 Notation

Let \mathbb{G} denote a cyclic group of prime order p ,

Sounds good, but how do you actually implement this?

What kind of elliptic curve should we use?

Edwards

e.g. Curve25519, FourQ

Weierstrass

e.g. secp256k1

fastest formulas



complete formulas



easy in constant time



prime-order group



Examples of cofactor problems

Ed25519 signature verification **differs between single and batch** verification

As specified in the RFC, the set of valid signatures is not defined!

Onion Service addresses in Tor had to add **extra validation**.

Cofactor problem: 8 addresses for the same server.

Monero had a **critical vulnerability** due to cofactors.

Cofactor problem: allowed **spending the same amount** 8 times.

Decaf & Ristretto: the best of both worlds

- **Decaf** - Mike Hamburg '15
 - Cofactor 4 reduction
- **Ristretto** - Mike Hamburg, Henry de Valence
 - Cofactor 8 reduction
 - Curve25519 has **cofactor 8**

Decaf: <https://eprint.iacr.org/2015/673.pdf>

Ristretto: <https://ristretto.group>

Curve25519 is fast!

- Curve25519 has **cofactor 8**
- Hisil, Wong, Carter, Dawson '08 introduced fast **parallel formulas** for Curve25519
- **Curve25519-dalek** is a fast, pure-Rust AVX2 implementation of those formulas

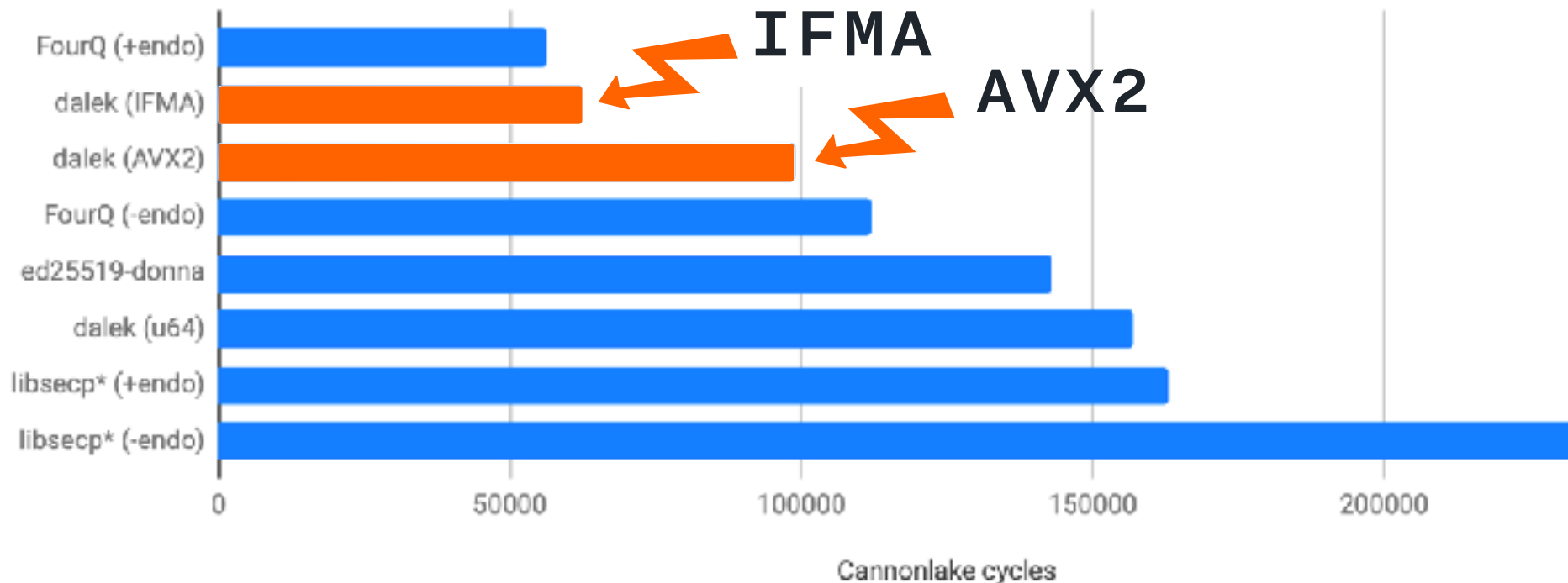
curve25519-dalek: https://doc-internal.dalek.rs/curve25519_dalek/backend/avx2/index.html

HWCD: <https://www.iacr.org/archive/asiacrypt2008/53500329/53500329.pdf>

Blog post: <https://medium.com/@hdevalence/accelerating-edwards-curve-arithmetic-with-parallel-formulas-ac12cf5015be>

Is this strategy fast? Yes!

Cost to compute $aA + bB$ for fixed B , variable A (e.g., signature verify)



ristretto255: a prime-order group up to **4x faster** than secp256k1.

The Fiat-Shamir Heuristic

Converts an **interactive** argument into a **non-interactive** one.

Idea: replace a verifier's **random challenges** with a **hash** of the prover's messages.

$$\mathcal{P}_{\text{IP}} \rightarrow \mathcal{V}_{\text{IP}} : L, R$$

$$\mathcal{V}_{\text{IP}} : x \xleftarrow{\$} \mathbb{Z}_p^\star$$

$$\mathcal{V}_{\text{IP}} \rightarrow \mathcal{P}_{\text{IP}} : x$$

Sounds good, but how do you actually implement this?

Hashing data is kind of complicated!

What if you **forget** to feed data into the hash?

What if your data is **ambiguously encoded** in the hash?

How do you handle **multi-round protocols**?

Where do you put **domain separators**?

... and many more edge cases.

What if there was a first-class transcript object?

Paper

$$\mathcal{P}_{|P} \rightarrow \mathcal{V}_{|P} : L, R$$

$$\mathcal{V}_{|P} : x \xleftarrow{\$} \mathbb{Z}_p^\star$$

$$\mathcal{V}_{|P} \rightarrow \mathcal{P}_{|P} : x$$

Implementation

```
transcript.commit_point(b"L", L);  
transcript.commit_point(b"R", R);
```

```
let x = transcript.challenge_scalar(b"x");
```

Merlin: STROBE-based transcripts for ZKPs

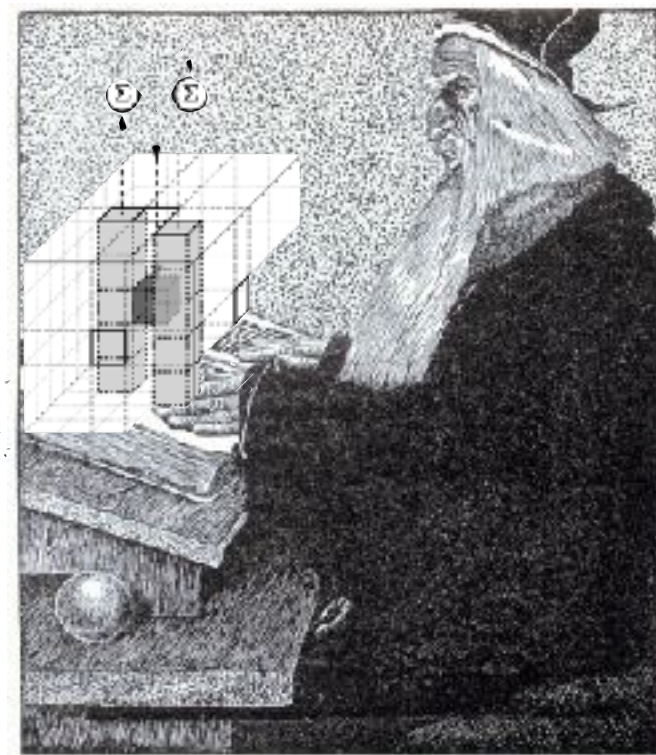
Implement protocols **as if they were interactive**, passing a **transcript** parameter.

Transformation is done in software, not by hand.

Byte-oriented API, automatic **message framing**.

Easy **domain separation**.

Automatic sequential **composition of proofs**.



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`https://github.com/
dalek-cryptography/bulletproofs`

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Proving

$$\mathbf{a}_L \in \{0, 1\}^n \text{ s.t. } \langle \mathbf{a}_L, \mathbf{2}^n \rangle = v$$

$$\mathbf{a}_R = \mathbf{a}_L - \mathbf{1}^n$$

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

$$A = h^\alpha g^{\mathbf{a}_L} h^{\mathbf{a}_R}$$

page 17, lines 36-45 of the Bulletproofs paper

Proving: paper & code

```
let alpha = Scalar::random(rng);  
let A = h * alpha + msm(g_vec, a_L) + msm(h_vec, a_R);
```

Pseudocode of implementation: `src/range_proof/party.rs` lines 84-110
and `src/range_proof/dealer.rs` lines 100-108

$$\mathbf{a}_L \in \{0, 1\}^n \text{ s.t. } \langle \mathbf{a}_L, 2^n \rangle = v$$

$$\mathbf{a}_R = \mathbf{a}_L - \mathbf{1}^n$$

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

$$A = h^\alpha g^{\mathbf{a}_L} h^{\mathbf{a}_R}$$

$$\mathbf{s}_L, \mathbf{s}_R \xleftarrow{\$} \mathbb{Z}_p^n$$

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

$$S = h^\rho g^{\mathbf{s}_L} h^{\mathbf{s}_R}$$

Proving: paper & code

```
let alpha = Scalar::random(rng);
let A = h * alpha + msm(g_vec, a_L) + msm(h_vec, a_R);
```

```
let s_L = (0..n).map(|_| Scalar::random(rng).collect());
let s_R = (0..n).map(|_| Scalar::random(rng).collect());
let rho = Scalar::random(rng);
let S = h * rho + msm(g_vec, s_L) + msm(h_vec, s_R);
```

$$\mathbf{a}_L \in \{0, 1\}^n \text{ s.t. } \langle \mathbf{a}_L, 2^n \rangle = v$$

$$\mathbf{a}_R = \mathbf{a}_L - \mathbf{1}^n$$

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

$$A = h^\alpha g^{\mathbf{a}_L} h^{\mathbf{a}_R}$$

$$\mathbf{s}_L, \mathbf{s}_R \xleftarrow{\$} \mathbb{Z}_p^n$$

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

$$S = h^\rho g^{\mathbf{s}_L} h^{\mathbf{s}_R}$$

$$\mathcal{P} \rightarrow \mathcal{V} : A, S$$

$$\mathcal{V} : y, z \xleftarrow{\$} \mathbb{Z}_p^*$$

$$\mathcal{V} \rightarrow \mathcal{P} : y, z$$

Proving: paper & code

```
let alpha = Scalar::random(rng);
let A = h * alpha + msm(g_vec, a_L) + msm(h_vec, a_R);
```

```
let s_L = (0..n).map(|_| Scalar::random(rng).collect());
let s_R = (0..n).map(|_| Scalar::random(rng).collect());
let rho = Scalar::random(rng);
let S = h * rho + msm(g_vec, s_L) + msm(h_vec, s_R);
```

```
transcript.commit_point(b"A", A);
transcript.commit_point(b"S", S);
let y = transcript.challenge_scalar(b"y");
let z = transcript.challenge_scalar(b"z");
```

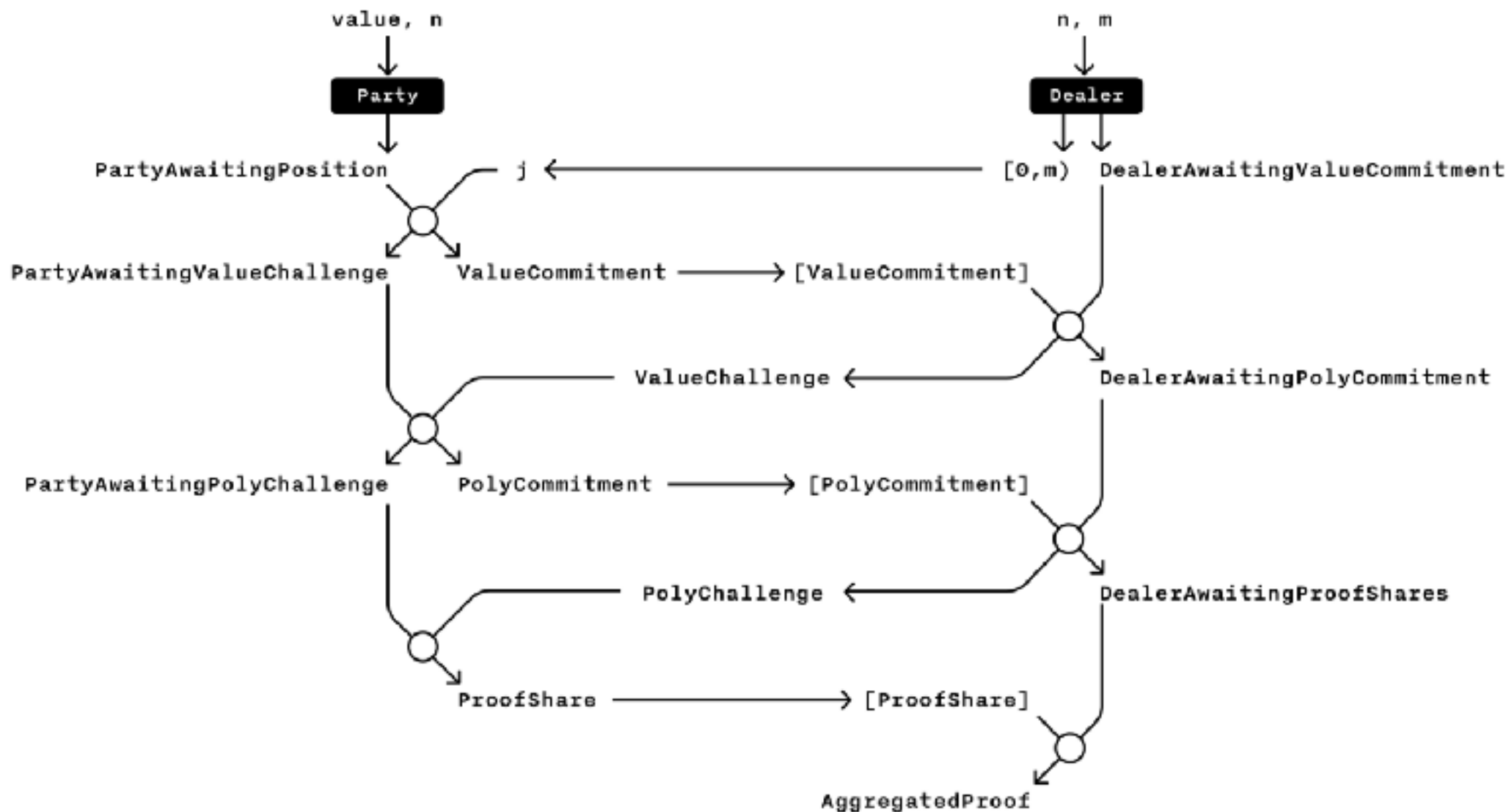
The story

- 1 Motivation
- 2 Understanding the paper
- 3 Tools of the trade

The code

- 4 Range proof
- 5 **Rust tricks**
- 6 Above and beyond

Session types for MPC



Optimizations

Rust iterators

Lazy and zero-cost*

- Can build up points & scalars using Rust iterators & pass them into the multiscalar API to inline computation
- Don't have to do extra allocations or manage temporaries

$$Q = c_1 P_1 + \dots + c_n P_n$$

* except for build times

Performance of 64-bit rangeproof verification

<1 millisecond, with SIMD backends in curve25519-dalek

IFMA

3x faster than libsecp256k1, **7x** faster than Monero.

AVX2

2x faster than libsecp256k1, **4.6x** faster than Monero.

The story

- 1 Motivation
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- 5 Rust tricks
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Constraint System API
for fully programmable proofs

Constraints

Multiplicative constraint (secret-secret multiplication):

$$x \cdot y = z$$

Linear constraint (secret variables with cleartext weights):

$$a \cdot x + b \cdot y + c \cdot z + \dots = 0$$

Why constraint systems?

A constraint system can represent
any efficiently verifiable program.

A **CS proof** is proof that all the constraints
are **satisfied** by certain **secret** inputs.

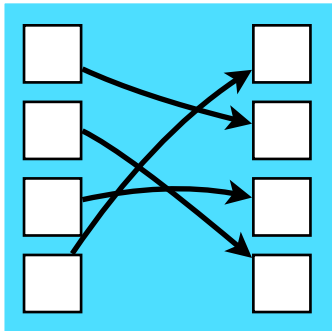
FURTHER READING

<https://medium.com/interstellar/programmable-constraint-systems-for-bulletproofs-365b9feb92f7>

Cloak:
a confidential assets protocol

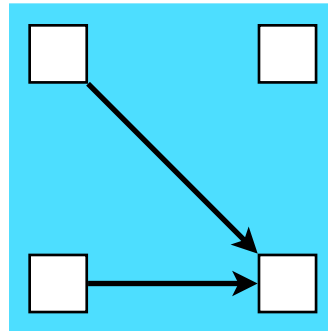
Composition of gadgets in Cloak

Cloak transaction is a combination of smaller gadgets with different roles.



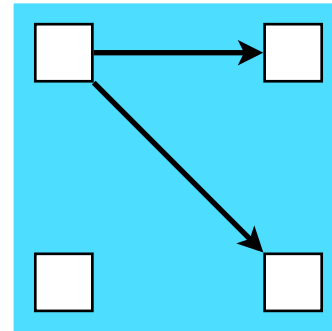
SHUFFLE

Secretly **reorder**
N values.



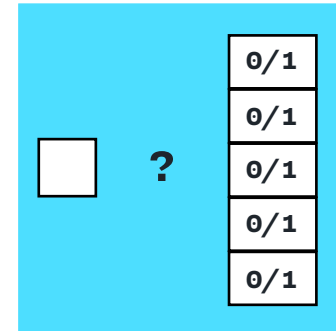
MERGE

Secretly **merge or**
move two values.



SPLIT

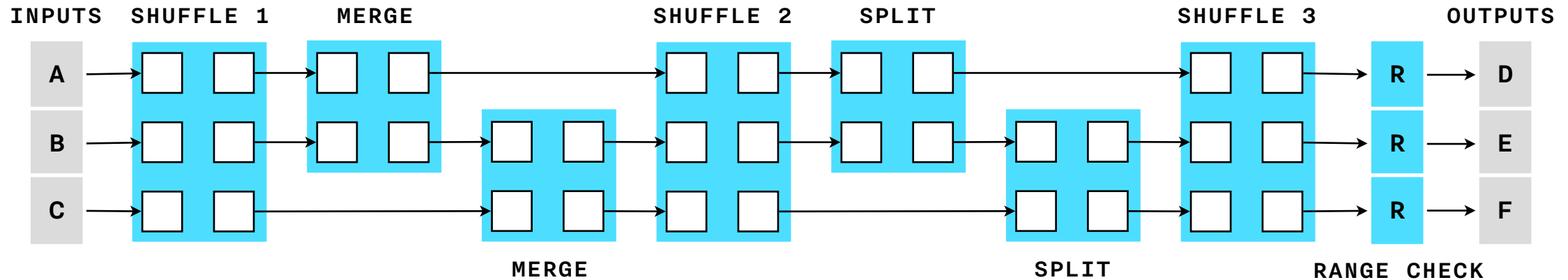
Secretly **split or**
move two values.



RANGE

Check that value is
not negative.

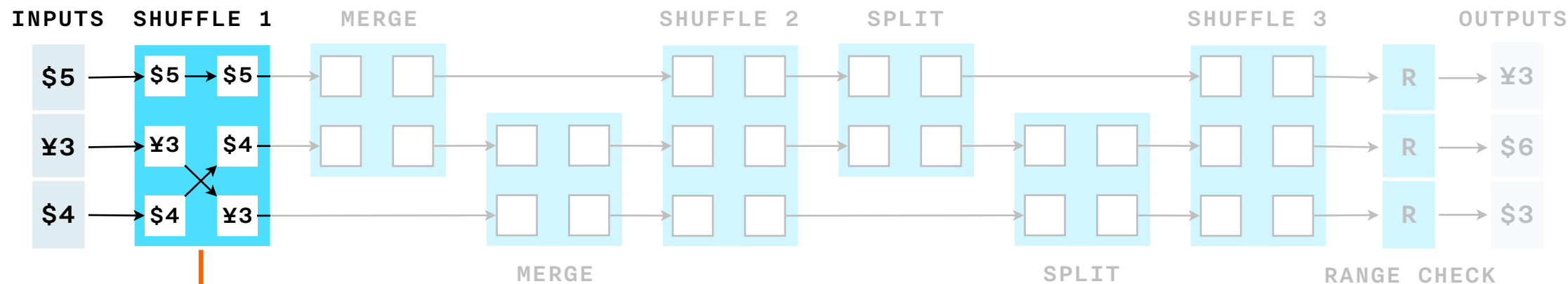
Cloak transaction



Observers cannot tell where values are actually **split**, **merged** or **moved** without modification.

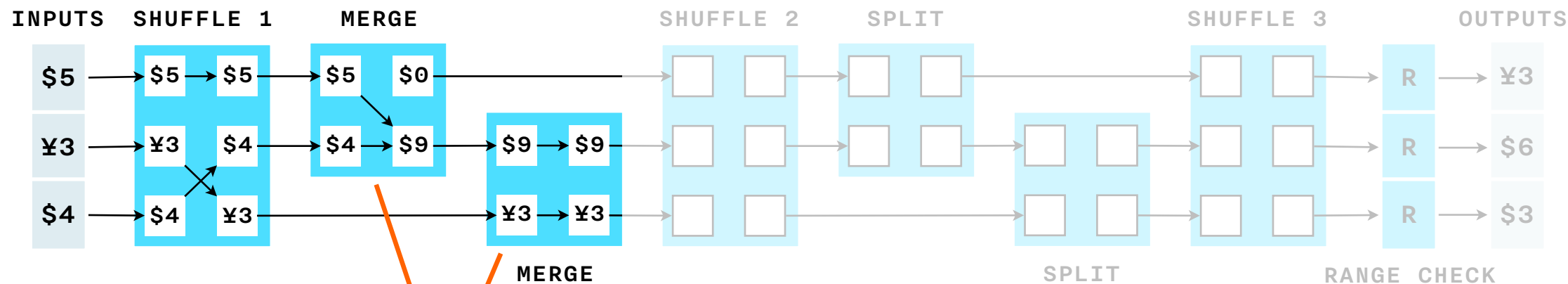
Only the prover knows where values are **modified** or **moved**.

Cloak walkthrough



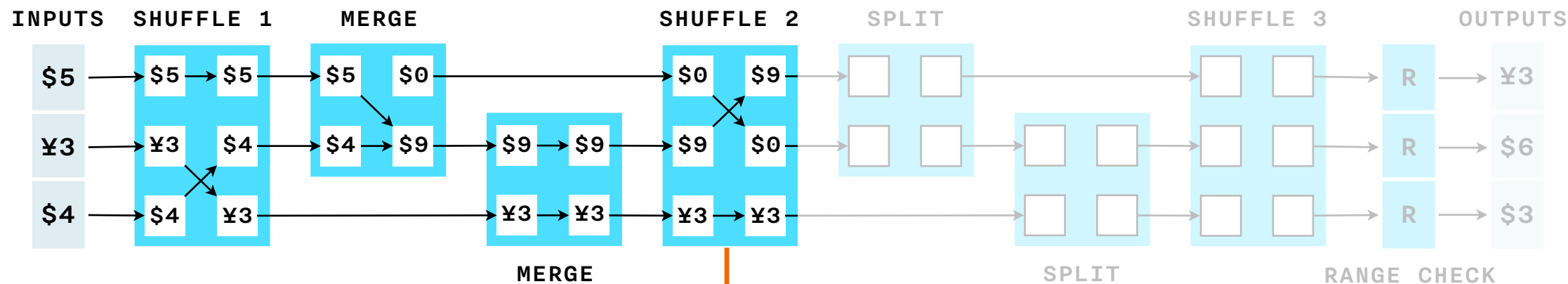
Randomly ordered input values
are grouped by asset type.

Cloak walkthrough



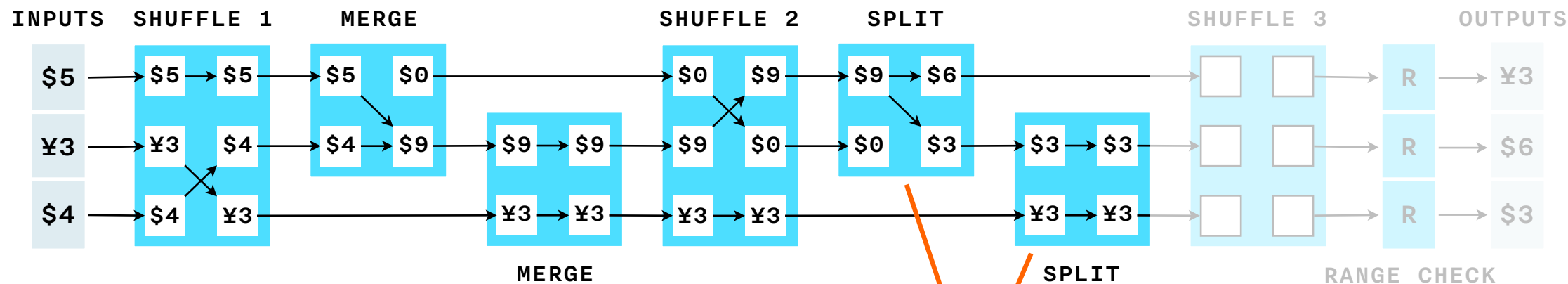
Values of the same asset type
are fully merged together.

Cloak walkthrough

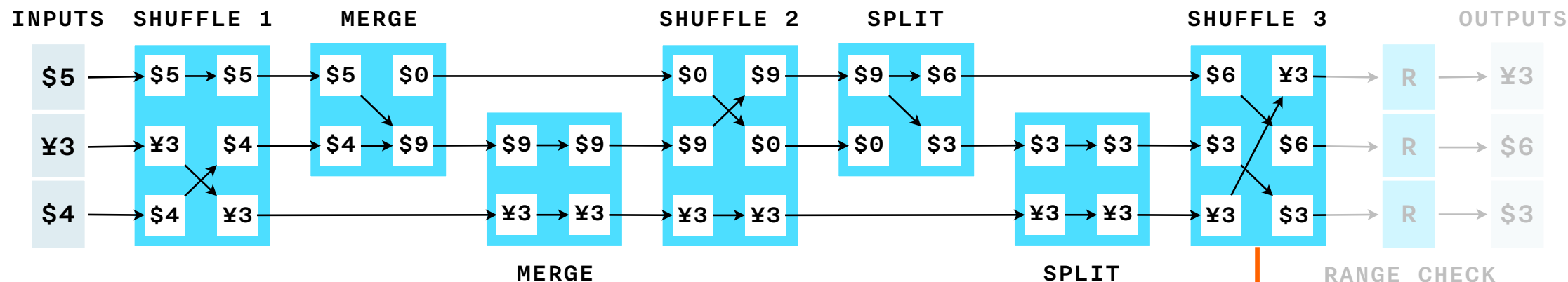


Non-zero values are reordered to the top, still grouped by asset type.

Cloak walkthrough

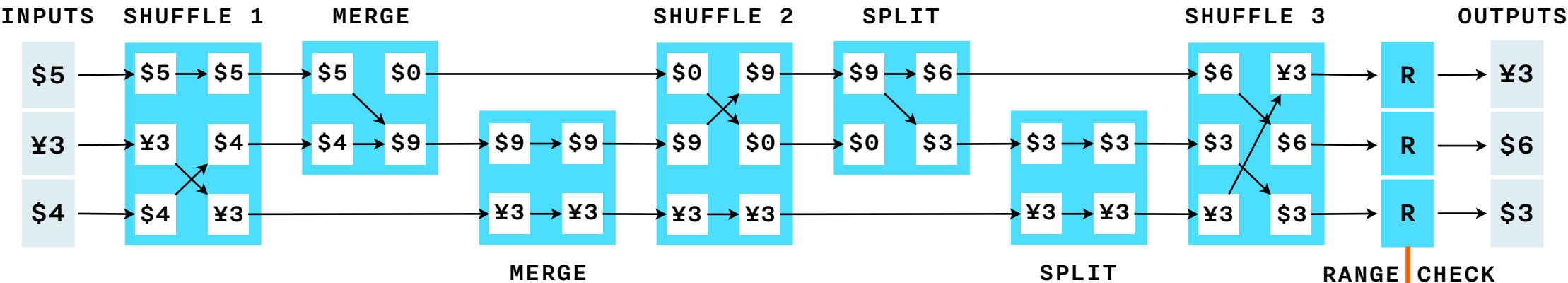


Cloak walkthrough



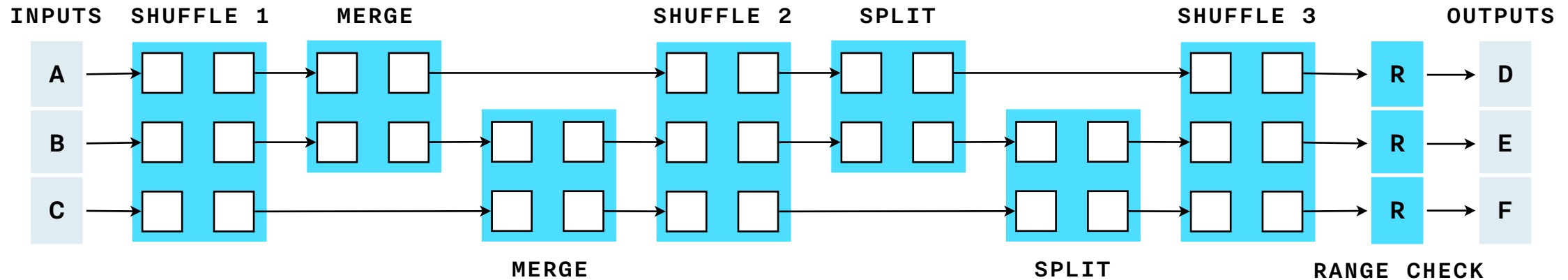
Values that were grouped by asset type
are shuffled into a random order.

Cloak walkthrough



All values are checked
to be non-negative.

Complete 3:3 Cloak transaction



Transactions of the same size are **indistinguishable**.

SPEC & CODE

<https://github.com/stellar/slingshot/spacesuit>

ZkVM:
a zero-knowledge
smart contract language

<https://github.com/stellar/slingshot/ZkVM>

Thanks!

Henry de Valence

@hdevalence

Oleg Andreev

@oleganza

George Tankersley

@gtank__

Deirdre Connolly

@durumcrustulum

Further Reading

Cathie Yun
[@cathieyun](#)

Bulletproofs paper:

<https://eprint.iacr.org/2017/1066.pdf>

Open-source GitHub repo for Bulletproofs in Rust:

<https://github.com/dalek-cryptography/bulletproofs>

Notes on the Bulletproofs math & implementation docs:

<https://doc.dalek.rs/bulletproofs/index.html>

Slide deck:

<https://speakerdeck.com/cathieyun>