

# accumulators

## efficient set algorithms

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edge / dev++ / scaling

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**intro**

**Hi I'm Tadge Dryja**

**worked on / authored lightning  
network & discreet log contracts**

**today: accumulators, utreexo**

**For questions, interrupt? or come bug me after**

what's this about "accumulators"?

Cryptography has lots of fun tools,  
not just encryption, or signing.

Cryptography to increase the  
scalability of Bitcoin? Sounds good!

As with all engineering, lots of  
trade-offs

goal

We want to keep track of, like,  
billions of things.

And it should only take up 1KB or so.

Maybe sounds crazy? But doable.

# hash functions

you may have heard of them!

$h(x) = y$ ;  $y$  looks unrelated to  $x$

"one way": given  $y$ , can't find  $x$

"collision free", can't find  $x, x'$   
such that  $x \neq x', h(x) = h(x')$

## file digest

an important property is that  $x$  and  $y$  aren't the same length.  $x$  can be much longer than  $y$ .

This is useful: take a big file, and only save the hash of it. Can verify the file was unmodified later.

set digest

what if we want more flexibility?

Like a set of  $n$  files, instead of just 1 file?

We could just save the hashes of each file, which works OK, but takes up  $O(n)$  space. (32 bytes \*  $n$ )

set digest

We want to store less than  $O(n)$ ;  
maybe  $O(\log(n))$  or  $O(1)$ .

Also, it would be cool if we could  
add and remove from these sets later  
on, and prove membership or  
non-membership.



## accumulators

This set digest is called an accumulator. The basic functions are

`gen()`  $\rightarrow$  `acc`

`add(acc, element)`  $\rightarrow$  `acc, proof`

`verify(acc, element, proof)`  $\rightarrow$  `bool`

accumulators

Merkle tree

can classify it as a "static"  
accumulator

You can add many elements, but only once. Can prove inclusion, but given the root, you can't add more elements

accumulators

accumulator terms

"Dynamic": There's a Remove() function in addition to Add(), which does what you'd think

"Universal": There's a Prove() and Verify() for elements not in the set.

# RSA accumulator

RSA-based accumulators...

Wait, RSA? Tough to cover in a few minutes, but a quick refresher!

The original digital signature algorithm. Also does encryption.

Powerful, but a bit of a minefield.

Implement with caution!

# RSA

pubkey: make 2 prime numbers, p, q.

$n = pq$ . n is the public key.

private key:  $\phi = (p-1)(q-1)$

e = 3 or something (65537 is safer I guess)

m = some message (hash)

d = computed from phi such that

$$(m^e)^d \equiv (m^d)^e \equiv m \pmod{n}$$

# RSA

encrypt:  $c \equiv m^e \pmod n$

decrypt:  $m \equiv c^d \pmod n$

sign:  $s \equiv m^d \pmod n$

verify:  $m \equiv s^e \pmod n$

cool!

## RSA accumulating

for the accumulator  $n = pq$ , but there is no  $d$  and no  $e$ .

Start with  $v = 3$  or some other starter prime.

Every element  $x$  in the set must be prime, so need to hash onto primes

# RSA accumulating

Add(x, v):  $v' \equiv v^x \pmod n$

keep doing that for  $x_1, x_2, x_3 \dots$

Prove(x, v): an inclusion proof p is the accumulator v with every element *\*except\** x added

Verify(x, p, v):  $p^x \equiv? v \pmod n$



# RSA accumulator properties

constant size:  $v$ ,  $p$ ,  $x$  --

everything's the same length as  $n$ ,  
regardless of number of elements

Can prove many inclusions at once,  
again same size

## RSA accumulator issues

$p, q$  are trusted setup. Anyone who knows  $p, q$  can create false proofs while proofs are aggregatable, proof updates are not

# RSA proof updates

many proofs  $p_1 = v^{x-x_1}$ ,  $p_2 = v^{x-x_2}$ ,  
 $p_3 = v^{x-x_3} \dots$

add single element  $x_8$

must to compute  $p_1^{x_8}$ ,  $p_2^{x_8}$ ,  $p_3^{x_8}$

adding multiple elements  $x_8$ ,  $x_9$

must compute  $(p_1^{x_8})^{x_9}$ ,  $(p_2^{x_8})^{x_9}$ ,  $(p_3^{x_8})^{x_9}$

What do we want to accumulate?

How about accumulating some bitcoins?

If proof updates are few /  
infrequent, then we're OK.

But if we're looking at the UTXO set,  
proof updates happen every 10  
minutes.

What do we want to accumulate?

If we wanted to prove every bitcoin:

60M utxos

~6K updates every 600 sec (10/sec)

For individual proofs,  $60M * 10 =$   
600M exponentiations / sec

@1ms per op, need 600K cpu cores!

# scalability

Do we need to keep proofs for every possible transaction?

Maybe not; if wallets keep track of their own UTXOs and proofs, it's much more reasonable

# scalability

Lightly used wallet: 10 utxos

6K updates per block \* 10 txos =  
60K exponentiations per block

@1ms each, that's 1 minute of CPU  
time per block

Doable, but still lots of work

## RSA setup vs class groups

If we can deal with the CPU load, we still have the trusted setup

Possible solution: Class groups of binary quadratic forms

Group of unknown order with no trusted setup. Possibly slower, novel, but could help!



What about those merkle trees?

What about hash based, tree-like accumulators?

Some previous research, but not dynamic without a manager

Next talk: novel hash-based dynamic accumulator optimized for bitcoin:  
utreexo