

A FHE COMPILER PIONEERING CIRCUIT BOOTSTRAPPING

# Paraso

01	Motivation
02	The promise of circuit bootstrapping
03	Parasol's design
04	Numbers



### CGGI/TFHE based approach

- Comparisons over encrypted data
  - BFV, CKKS not appropriate
- For our motivating use case, we were OK with...
  - Large-ish machine
  - Custom program
  - Not performing further computation after auction is complete
- Can we get better performance than what's out there in libraries today?

### CGGI (aka TFHE) based approach

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#### What approaches for computation and noise reduction exist in TFHE?

### How to reduce noise (aka bootstrap)

01

#### Gate

- Just reduce noise
- Binary messages
- LWE —> LWE

02

#### Programmable (PBS)

- Reduce noise + apply function
- Messages >1 bit
- LWE -> LWE

03

#### Circuit (CBS)

- Just reduce noise
- Binary messages\*
- Generally used for leveled computation
- LWE -> GGSW

(depends on how you bootstrap!)

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#### Gate

- Generate boolean circuit using standard circuit design techniques
- Bootstrap per gate

02

#### Programmable (PBS)

- Break up input (e.g. 4 bits per ciphertext)
- Use a series of PBS ops with different lookup tables

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#### Circuit (CBS)

- Use CMUXs to realize computation
- Use CBS to reduce noise and obtain GGSW input

(depends on how you bootstrap!)

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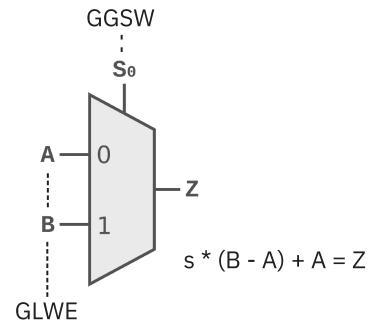
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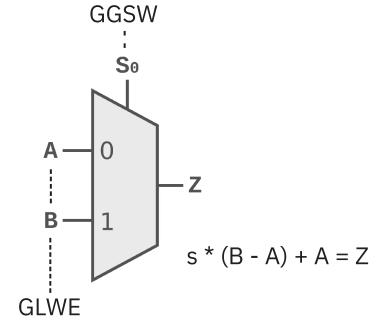
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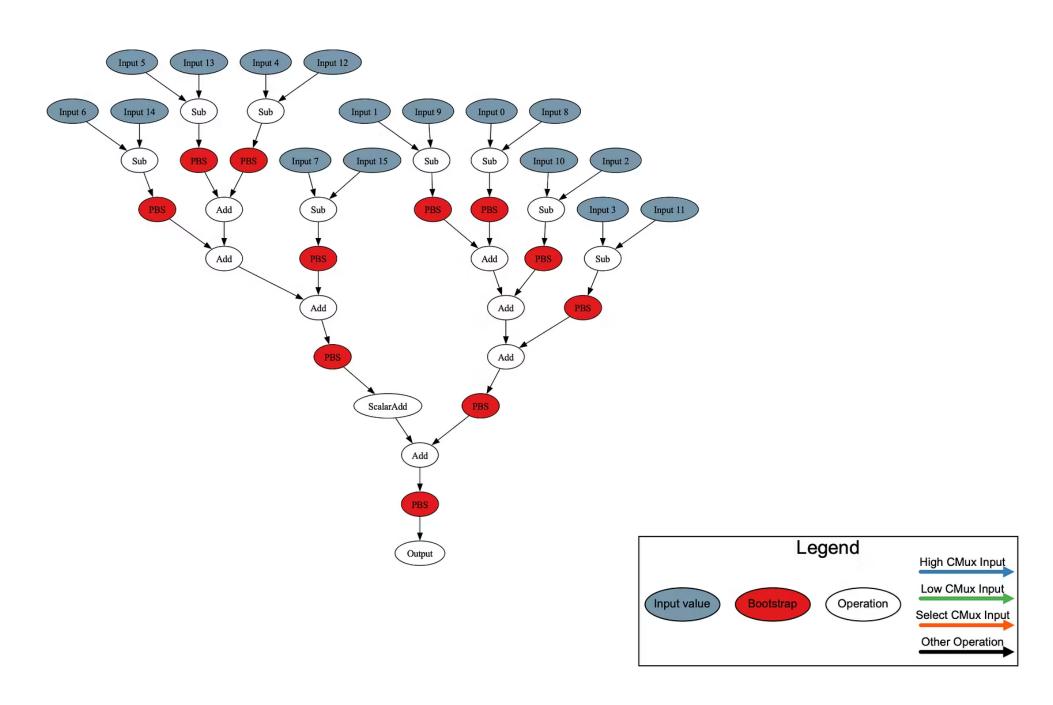
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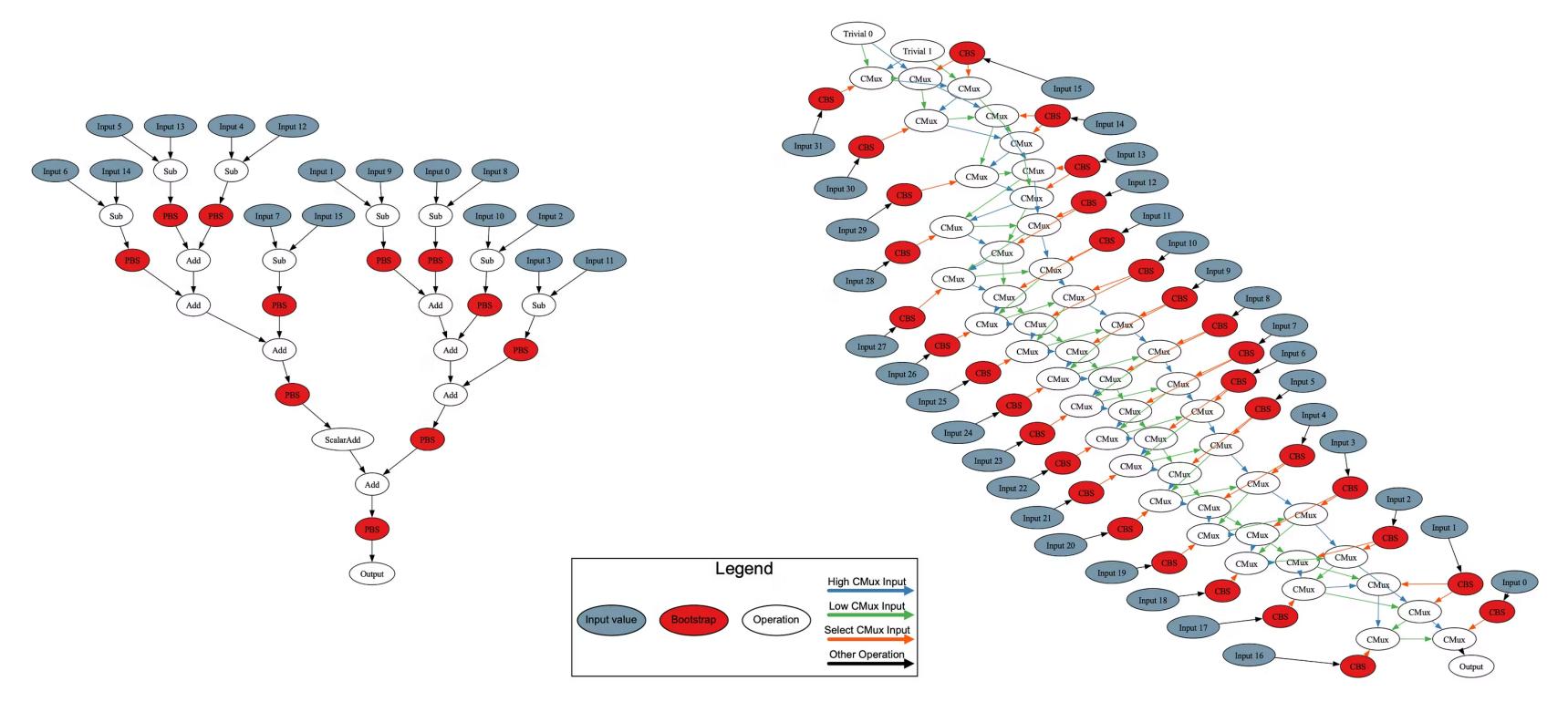
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- 1 CBS op in critical path
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A CBS op is slower than a PBS. Can we realize any perf improvements in practice?

#### Yes we can...

- c7a.16xlarge machine (64 cores)
- 128 bits of security
- LHS uses tfhe-rs 1.1.3
- RHS is our own implementation
  - Additional optimization in multiply

	PBS	CBS
8-bit Greater than	34.47 ms	28.88 ms
16-bit Greater than	51.50 ms	32.54 ms
32-bit Greater than	70.07 ms	47.09 ms
8-bit Add	51.66 ms	29.65 ms
16-bit Add	51.71 ms	33.34 ms
32-bit Add	72.72 ms	47.89 ms
8-bit Multiply	88.67 ms	34.25 ms
16-bit Multiply	137.12 ms	54.24 ms
32-bit Multiply	279.35 ms	166.08 ms

### Downsides of CBS-CMUX approach

- More memory-intensive than gate bootstrapping
- Need sufficient cores to parallelize computation
- Extremely complex to build performant programs with this approach

## How can we bring the CBS-CMUX approach to non-experts?

Build an FHE compiler!

### Design goals of Parasol

- Better performance (in part due to the CBS-CMUX approach)
- Write in a mainstream language (no eDSL required)
- Compact programs (not covered in this talk!)

```
#include <stdbool.h>
#include <stdint.h>
typedef struct Winner {
   uint16 t bid:
   uint16_t idx;
} Winner;
void auction(
   uint16_t *bids.
   uint16_t len,
    Winner *winningBid
    winningBid→bid = bids[0];
   winningBid\rightarrowidx = 0;
    for (uint16_t i = 1; i < len; i++) {
        bool isWinner = bids[i] ≥ winningBid→bid;
       winningBid->bid = isWinner ? bids[i] : winningBid->bid;
       winningBid→idx = isWinner ? i : winningBid→idx;
```

```
#include <stdbool.h>
#include <stdint.h>
typedef struct Winner {
    uint16_t bid;
    uint16_t idx;
} Winner;
[[clang::fhe_program]] void auction(
     [[clang::encrypted]] uint16_t *bids,
    uint16_t len,
     [[clang::encrypted]] Winner *winningBid
    winningBid→bid = bids[0];
    winningBid\rightarrowidx = 0;
    for (uint16_t i = 1; i < len; i++) {
         bool isWinner = bids[i] ≥ winningBid→bid;
         winningBid->bid = isWinner ? bids[i] : winningBid->bid;
winningBid->idx = isWinner ? i : winningBid->idx;
```

#### Parasol

Looking under the hood...

#### LLVM-based compiler

- Developers write in C, tag FHE functions and inputs appropriately
- Modified version of clang that supports the Parasol processor

### Virtual processor

- Custom ISA to execute programs over a mix of plaintext and encrypted data
- OUt-of-order processor design
- Backend circuit processor implements CBS-CMUX approach

### TFHE library

- Comprehensive implementation of TFHE scheme
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- Comprehensive implementation of TFHE scheme
- Features recent optimization for CBS (WHS+25)

### So what ever happened to that auction?

- ~15-17x faster than the current SotA
- c7a.16xlarge machine
- 16-bit precision
- Parasol/Concrete provide ~128 bits of security;
   Google/Cingulata/Juliet are ~118 bits; E3 ~94 bits

	Runtime (secs) for number of bids				
Compiler	2	4	8	16	32
Parasol Compiler	0.098	0.275	0.625	1.315	2.714
Concrete <sup>1</sup>	24.1	86.4	264	694	1690
Google Transpiler	2.36	6.72	15.4	33.1	68.2
E3	12.4	36.6	84.8	182	379
Cingulata	1.48	4.33	10.3	22.4	47.2
Juliet	5.54	16.6	38.7	82.7	171

<sup>(1)</sup> We pass 16-bit input examples to maintain same input precision as other frameworks.



### Takeaways for the community

- CBS-CMUX approach is promising
  - Especially in the context of hardware acceleration!
  - Potential to unlock higher throughput + lower latency
- FHE compiler devex still has some way to go
  - LLVM-based approach is technically ambitious

## Find out more

EPRINT: 2025/1144

USE PARASOL: DOCS.SUNSCREEN.TECH

