

ZKProof Community Event  
The Edge, Deloitte, Amsterdam

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# Verifiable MPC

Berry Schoenmakers  
Coding & Crypto group  
Dept of Mathematics & Computer Science



Technische Universiteit  
Eindhoven  
University of Technology

Where innovation starts

# Outline

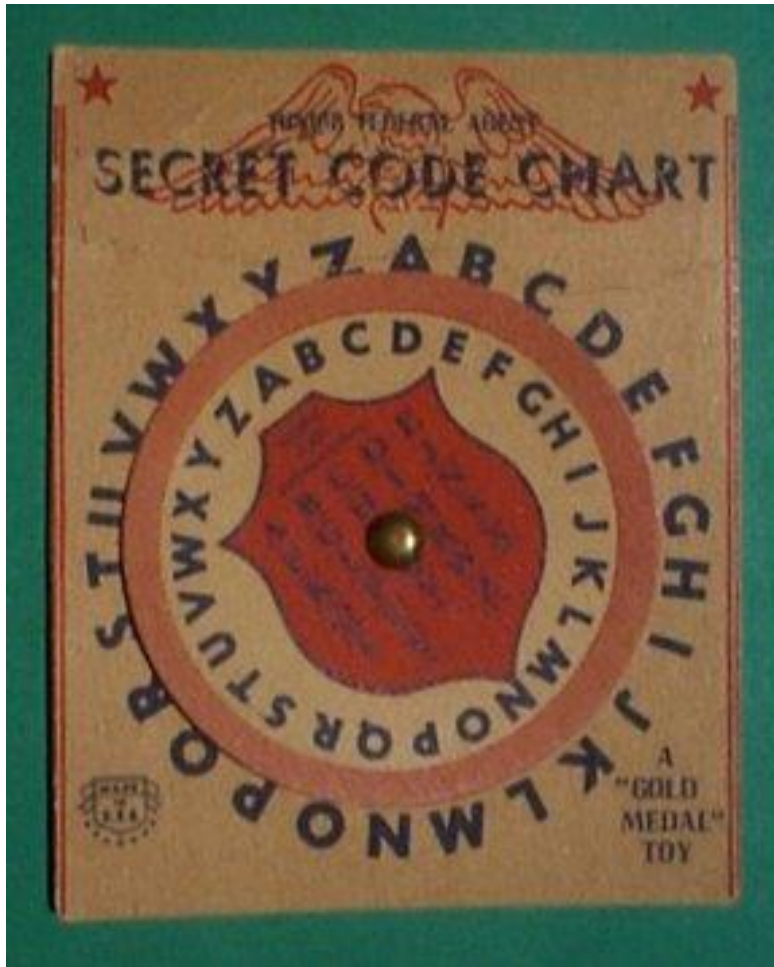
## Secure Multiparty Computation (MPC)

- I. MP<sub>y</sub>C @ TUE
- II. Verifiable MPC
- III. Verifiable MPyC

# Part I

MPyC @ TUE

# We've come a long way ...



Julius Caesar's  
**Crypto 1.0** gadget



Tom Verhoeff's  
**Crypto 2.0** gadget

# Crypto 1.0

## Crypto 1.0 concerns

- encryption and authentication of data
  - during communication and storage/retrieval
- protecting against **malicious outsiders**

## Crypto 1.0 primitives:

- **Keyless**
  - Cryptographic hash functions
  - Hash chains, Merkle trees
- **Symmetric (secret key)**
  - Stream/block ciphers
  - Message authentication codes
- **Asymmetric (public key)**
  - Public-key encryption
  - Digital signatures
  - Key-exchange protocols

## Modern Research into Crypto 1.0:

- Side channel resistant crypto
- **Post Quantum crypto**
- Lightweight crypto
- Quantum crypto
- ...

# Crypto 2.0

## Crypto 2.0 additionally concerns

- hiding identity of data owners or any link with them
- **partial information release of data**
- **computing with encrypted data**

protecting against **malicious insiders** (your **protocol partners**)

## Crypto 2.0 primitives:

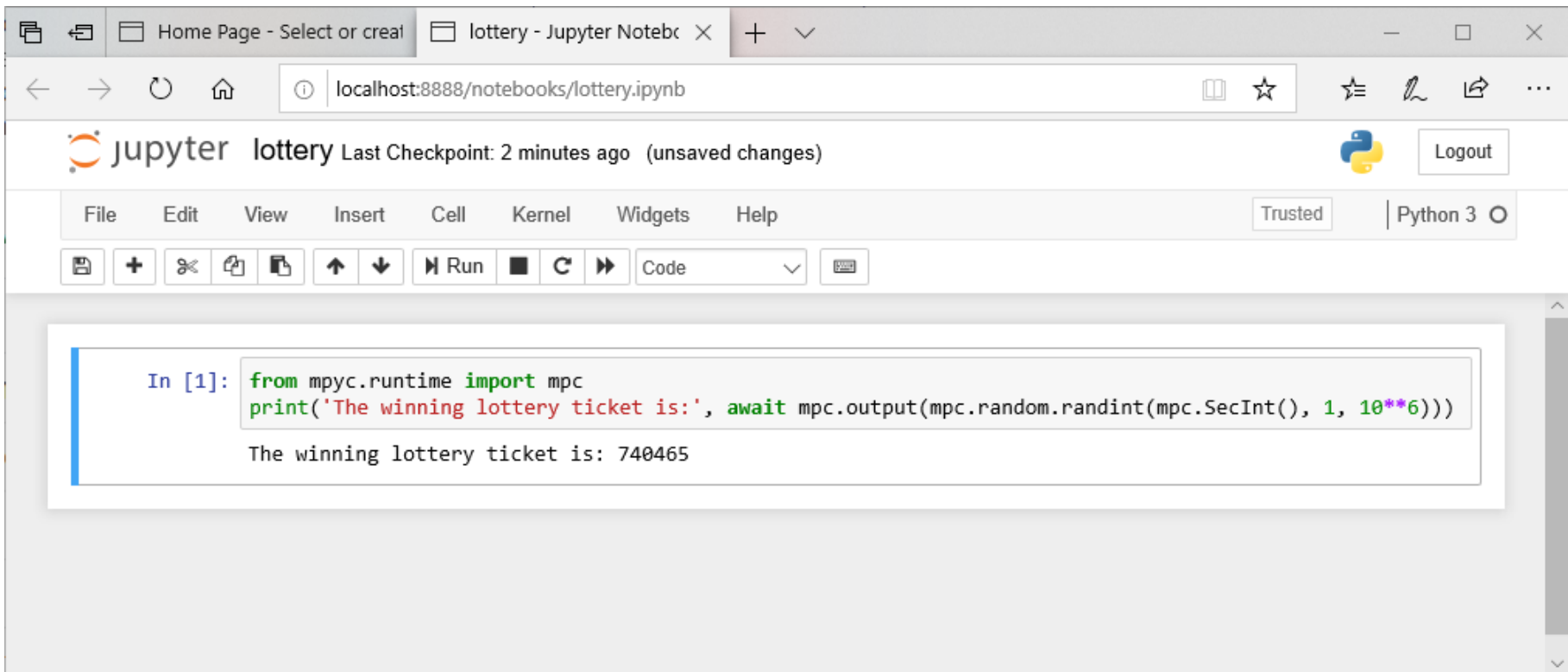
- **homomorphic encryption** Rivest/Adleman/Dertouzos '78
- **secret sharing** Blakley '79, Shamir '79
- **blind signatures** Chaum '82
- **oblivious transfer** M. Rabin. '81, EGL '85
- **zero-knowledge proofs** Goldwasser/Micali/Rackoff '85, GMW' 86
- **secure two/multiparty computation** Yao '82-86, GMW'87, BGW'88, CCD'88
- **secure time-stamping** Haber/Stornetta '90, BLLV' 98
- **functional encryption** Sahai/Waters '05, Boneh/Sahai/Waters '11, GKPVZ '13
- **fully homomorphic encryption** Gentry '09
- **indistinguishability obfuscation** Garg/Gentry/Halevi/Raykova/Sahai/Waters '13

# MPC @ TU Eindhoven

- PhD students:
  - Andrey Sidorenko, Mehmet Kiraz, José Villegas, **Sebastiaan de Hoogh**
  - Current: **Niels de Vreede**, **Frank Blom**, **Toon Segers**
- Postdocs:
  - Tomas Toft, Mikkel Krøigård, **Meilof Veeningen**
  - Current: **Niek Bouman**, **Stan Korzilius**
- Research projects:
  - Cybervote, PASC, SecureSCM, CACE, PRACTICE, THeCS
  - Current: SODA, **PRIVILEGE**
- **Verifiable MPC = MPC + ZKP**

# MPyC Secure Multiparty Computation in Python

- VIFF (2007) --> TUEVIFF (2012) --> **MPyC (2018)**
- **Secure lottery in MPyC:**



The screenshot shows a Jupyter Notebook window titled "lottery - Jupyter Noteb". The browser address bar shows "localhost:8888/notebooks/lottery.ipynb". The Jupyter interface includes a menu bar (File, Edit, View, Insert, Cell, Kernel, Widgets, Help) and a toolbar with icons for saving, adding cells, and running code. The notebook content shows a code cell with the following Python code:

```
In [1]: from mpyc.runtime import mpc
print('The winning lottery ticket is:', await mpc.output(mpc.random.randint(mpc.SecInt(), 1, 10**6)))
```

The output of the code cell is displayed below the code:

```
The winning lottery ticket is: 740465
```



# Privacy-Preserving Machine Learning

- **MPyC demos: ID3 decision trees, linear/ridge regression, neural networks (CNN and binarized MLP), Kaplan-Meier survival analysis, ...**

```
mympyc
C:\Users\Berry\Documents\GitHub\mympyc\demos>python id3gini.py -M5
Using secure integers: SecInt32
dataset: tennis with 14 samples and 4 attributes
2019-10-29 09:41:00,465 Start MPyC runtime v0.5.10
2019-10-29 09:41:00,981 All 5 parties connected.
2019-10-29 09:41:01,090 Attribute node 0
2019-10-29 09:41:01,106 Leaf node label 1
2019-10-29 09:41:01,168 Attribute node 3
2019-10-29 09:41:01,199 Leaf node label 0
2019-10-29 09:41:01,215 Leaf node label 1
2019-10-29 09:41:01,278 Attribute node 2
2019-10-29 09:41:01,293 Leaf node label 0
2019-10-29 09:41:01,324 Leaf node label 1
2019-10-29 09:41:01,324 Stop MPyC runtime -- elapsed time: 0:00:00.859313
Decision tree of depth 2 and size 8:
if Outlook == Overcast: Yes
if Outlook == Rain:
|   if Wind == Strong: No
|   if Wind == Weak: Yes
if Outlook == Sunny:
|   if Humidity == High: No
|   if Humidity == Normal: Yes
C:\Users\Berry\Documents\GitHub\mympyc\demos>
```

# Part II

## Verifiable MPC

# Trust in MPC?

- Can we trust the outcome of an MPC protocol?
- Yes, possibly:
  - e.g., if you take part in a 2-party protocol
  - or, if you take part in a  $m$ -party protocol tolerating  $m-1$  corruptions (everyone else potentially corrupt)
- No, if you do not take part!
  - MPC gives no security if all parties are corrupt!!

# Similar to situation for ZKPs?

- Suppose you observe ZKP run between P and V:

- P sends **announcement a** to V
- V sends **challenge c** to P
- P sends **response r** to V



**commitment  
to a nonce**

- Q: How convincing is this proof?
- A: Depends on who needs convincing!
  - V should be convinced
  - But as an observer you shouldn't
    - You may as well been watching a simulated **(a;c;r)**
- Make ZKP non-interactive to convince anyone.

# Limited Scope of MPC

- MPC → secure function evaluation  $y = f(x)$  **hiding input  $x$**
- What MPC does not achieve:
  - MPC does not stop parties from entering **bogus inputs**
    - e.g., Yao's millionaires (1982) can lie about their riches
  - MPC in outsourcing scenario:
    - Parties performing MPC could **ALL be corrupt**.
    - **Wrong result  $y^* \neq f(x)$**  cannot be detected.
      - Simulation-based security: indistinguishable views !
      - Active security does not help !

# The *World's Billionaires* Problem

Upgrade of Yao's *Millionaires' problem*:  
Privacy of inputs, verifiable inputs and outputs

## Verifiably correct input:

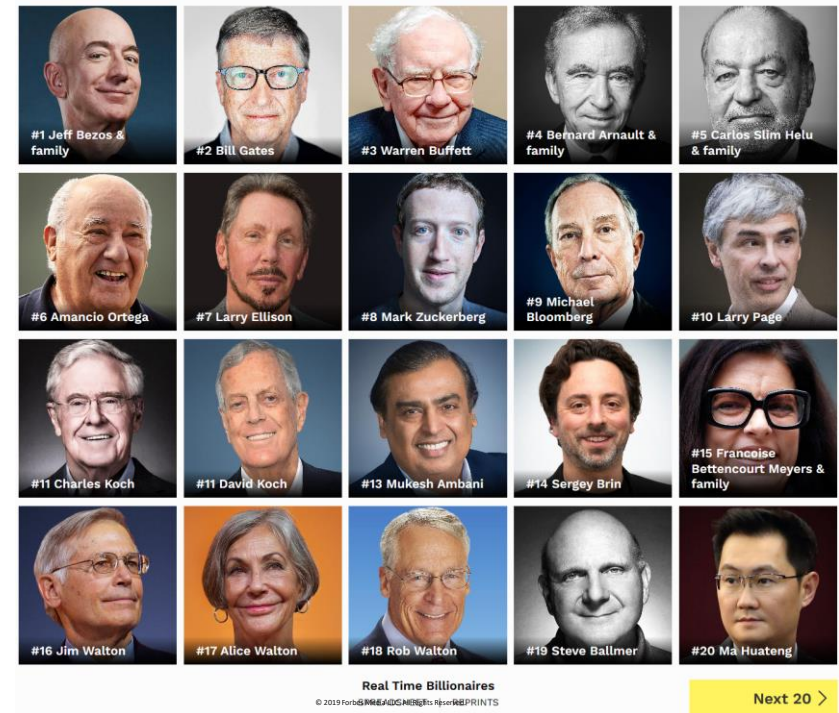
- Committed/encrypted tax returns
- Signed by the tax authority
- Posted on a blockchain

## Verifiably correct output:

- Top 400 billionaires world-wide

## Privacy:

- Privacy for all outside top 400



# Wannabe billionaires ...



WALL STREET

## Forbes says Commerce Secretary Wilbur Ross lied about being a billionaire

### KEY POINTS

PUBLISHED TUE, NOV 7 2017 • 8:06 AM EST | UPDATED TUE, NOV 7 2017 • 4:23 PM EST



Fred Imbert  
@FOIMBERT

SHARE

- "It seems clear that Ross lied to us," Forbes' report says.



Commerce Secretary Wilbur Ross, speaks at the Confederation of British Industry's annual conference in London, Britain, November 6, 2017.

Mary Turner | Reuters

# The *World's Billionaires* Problem

Upgrade of Yao's *Millionaires' problem*:  
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Verifiably correct input:

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Real Time Billionaires  
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Next 20 >

**World's Billionaires  $\approx$  sealed bid auction**  
(replace tax returns by sealed bids)



# Part III

## Verifiable MPyC

# Key ingredients for verifiable MPC

- **Verifiable input  $x$ :**

- Committed or **encrypted** input values
  - Public input values also possible
- Digitally signed
- Optionally, posted on blockchain (timestamp, uniqueness)

ElGamal  
encrypted  
inputs  $E(x_i)$

- **Verifiable output  $y = f(x)$ :**

- Committed or **encrypted** output values
  - Public output values also possible
- Threshold signed
- Optionally, posted on blockchain
- Noninteractive **ZKP** that  $y = f(x)$  holds.

ElGamal  
encrypted  
output  $E(y)$   
with  $y = \prod_i x_i$   
+ **ZKP** that  
this holds

# Computation vs proofs (verification)

- For  $y = f(x)$ :
  - **Compute**  $y$  from  $x$
  - **Compute proof** for  $y = f(x)$
- **Verification** can be much easier than **computation**!
  - NP-complete problems:
    - computation  $\rightarrow$  exponential time?
    - verification  $\rightarrow$  polynomial time
  - $y = 1/x$  harder to compute than verifying  $x * y = 1$
  - $y = \sqrt{x}$  harder to compute than verifying  $y * y = x$
  - ...

# Extend MPyC

- Details of secure computation protocols transparent in MPyC:
  - sophisticated operator overloading combined with asynchronous evaluation of associated protocols
  - we like to retain this for verifiable MPyC
- Secure m-party computation tolerating dishonest minority of t passively corrupt parties,  $1 \leq 2t+1 \leq m$ 
  - Case  $m = 1$  included: verifiable MPC with 1 party corresponds to ordinary ZK proofs for statements of the form  $y = f(x)$

# Candidate ZK Proofs for MPC

- **Pinocchio-based: multiparty computation of proof**
  - **Prototype for simple arithmetic**
    - Building on work by Meilof Veeningen (on GitHub)
    - Trinocchio/Geppetri protocols
    - pysnark
- **Sigma-proofs can be used for simple cases:**
  - E.g., threshold Schnorr signatures are obtained for function  $f(sk; m) = (c; r)$  where  $c = H(g^r/pk^c; m)$
- **Bullet-proofs: nice middle ground**

# Extend MPyC

- MPyC protocols based on threshold secret sharing:
  - Shamir threshold scheme
  - PRSS (pseudorandom secret sharing)
- Need **conversion** between **encrypted** inputs/outputs and **secret-shared** representation
  - involves threshold (multiparty) decryption
  - prototype for ElGamal encryption

# Conclusion

- **MPyC: pure Python (runs on Cpython and PyPy), small footprint (5000 lines), code on GitHub**
- **If sufficient number of parties can be trusted:**
  - **ordinary MPC for privacy and correctness,**
- **If potentially all parties are corrupt:**
  - **verifiable MPC ensures no false results are accepted**
    - **Case  $m=1$  party corresponds to ZKP**
    - **Much harder to do than ordinary MPC**
    - **But verification is easier than computation**

# H2020 EU-projects



[privilege-project.eu](http://privilege-project.eu)



[soda-project.eu](http://soda-project.eu)

This work is part of projects that have received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 780477 (PRIVILEGE) and No 731583 (SODA)



# MPyC: core modules



gmpy.py



finfields.py



gfpx.py



thresha.py



sectypes.py



runtime.py



asynco.py



random.py



mpctools.py