

Formally proving crypto properties of pseudorandom number generators

Katherine Ye '16
advised by Andrew Appel and Matt Green

DILBERT By SCOTT ADAMS

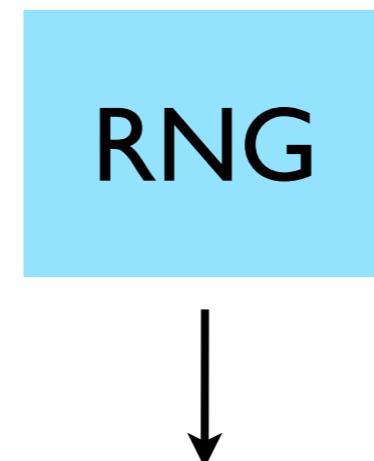
TOUR OF ACCOUNTING

OVER HERE
WE HAVE OUR
RANDOM NUMBER
GENERATOR.



- Most modern cryptosystems rely on random numbers
- e.g. RSA generates random big primes that become a private key
- Reducing the entropy of a cryptosystem's pseudo-random number generator (PRG) is an easy way to break the entire cryptosystem

Random number generator



101110011010101100001011001000001111101111000111110011011101000000010

Pseudo-random number generator

1100101



PRG



111111011111010010101100110001000111011111010111000101010100011000

Pseudo-random number generator

1100101



PRG



111111011111010010101100110001000111011111010111000101010100011000
≈
0010111001101010110000101100100000111110111100011110011011101000000001

Pseudo-random number generator

1100101



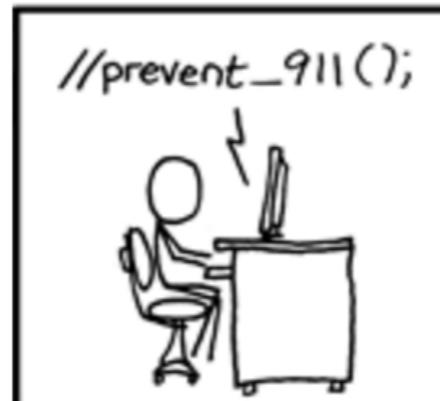
PRG



1111110111110100101011001100010001111011111010111000101010100011000
0010111001101010110000101100100000111110111100011110011011101000000001

! ≈

Debian OpenSSL PRG



<https://www.xkcd.com/424/>

- Removed sources of system entropy → only 32,767 choices
- Predictable SSL/SSH keys (Spotify, Yandex...)
- Can read encrypted traffic, log into remote servers, forge messages
- Have to patch servers AND replace weak keys

<https://freedom-to-tinker.com/blog/kroll/software-transparency-debian-openssl-bug/>

- **We need secure PRGs**
- But surprisingly little work exists on proving PRGs secure, either on paper or formally

Until now!

Goal: formally prove **functional correctness** and **cryptographic security** of a widely-used implementation of a PRG

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mbedTLS



HMAC-DRBG

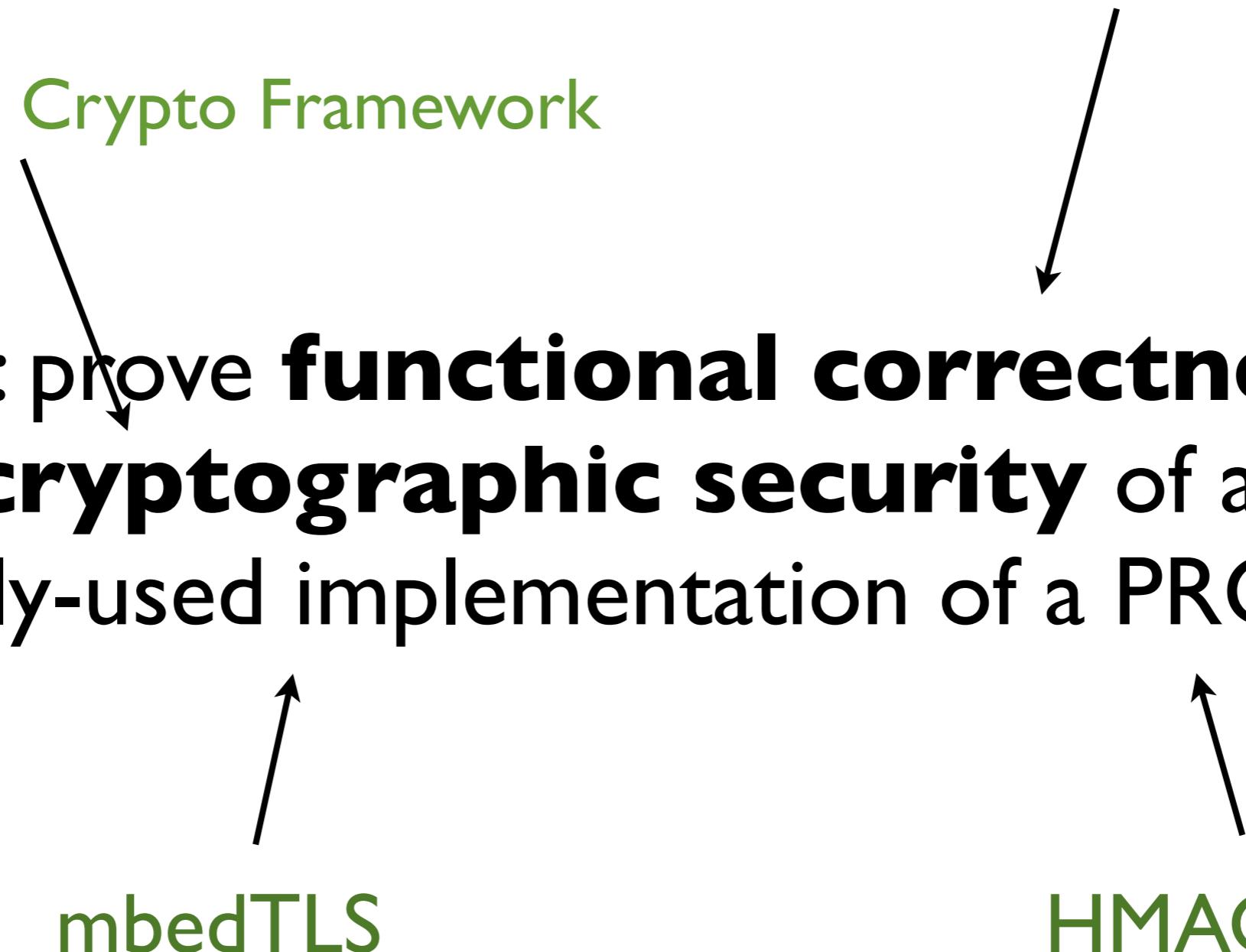
Verified Software Toolchain

Foundational Crypto Framework

Goal: prove **functional correctness** and **cryptographic security** of a widely-used implementation of a PRG

mbedTLS

HMAC-DRBG



Our project

NIST paper spec
of HMAC-DRBG

mbedTLS
implementation of
HMAC-DRBG

$x \rightarrow y$:
 x implements y

Our project

NIST paper spec
of HMAC-DRBG

assume
correct

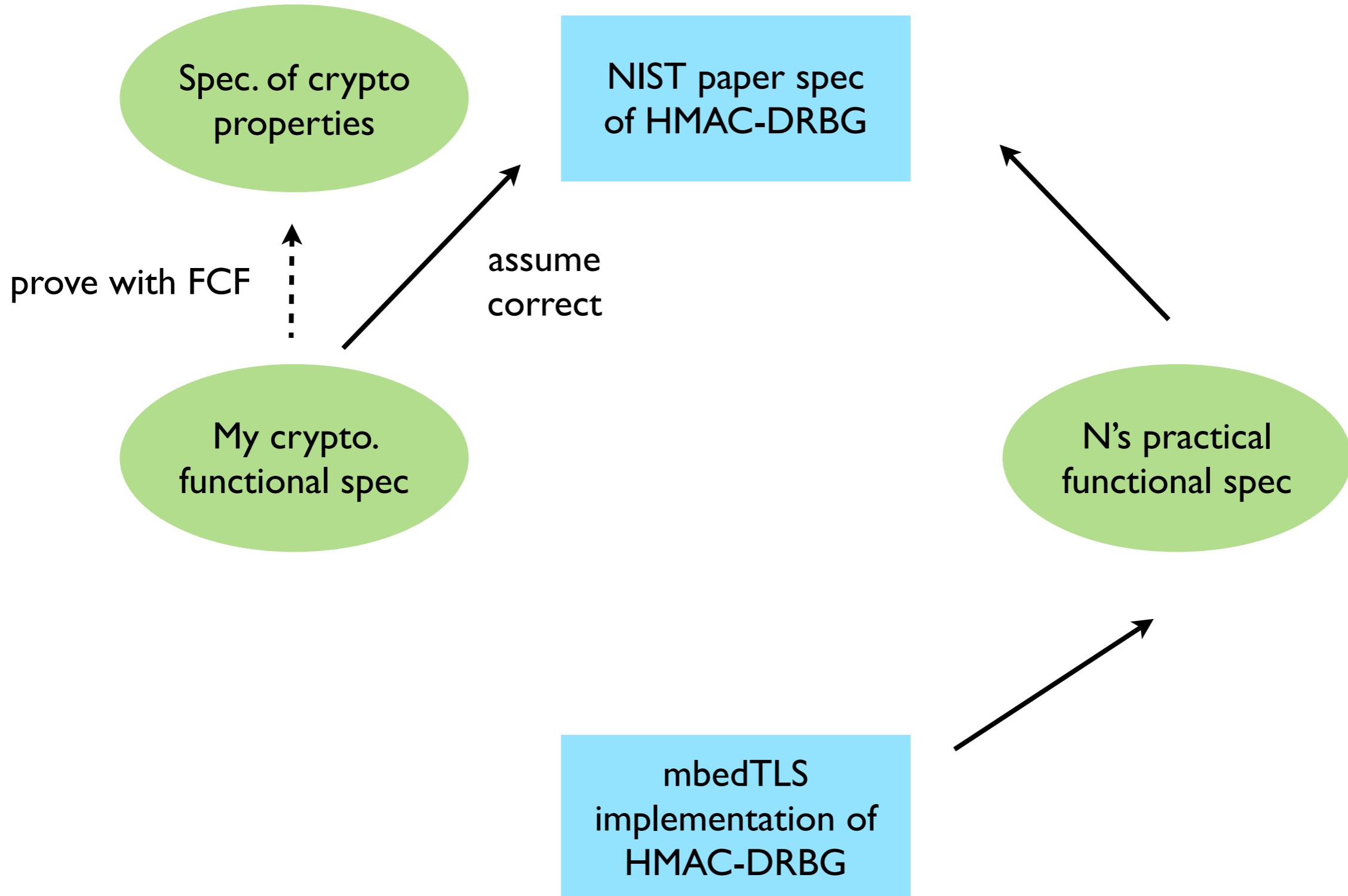
N's practical
functional spec

mbedTLS
implementation of
HMAC-DRBG

prove with VST

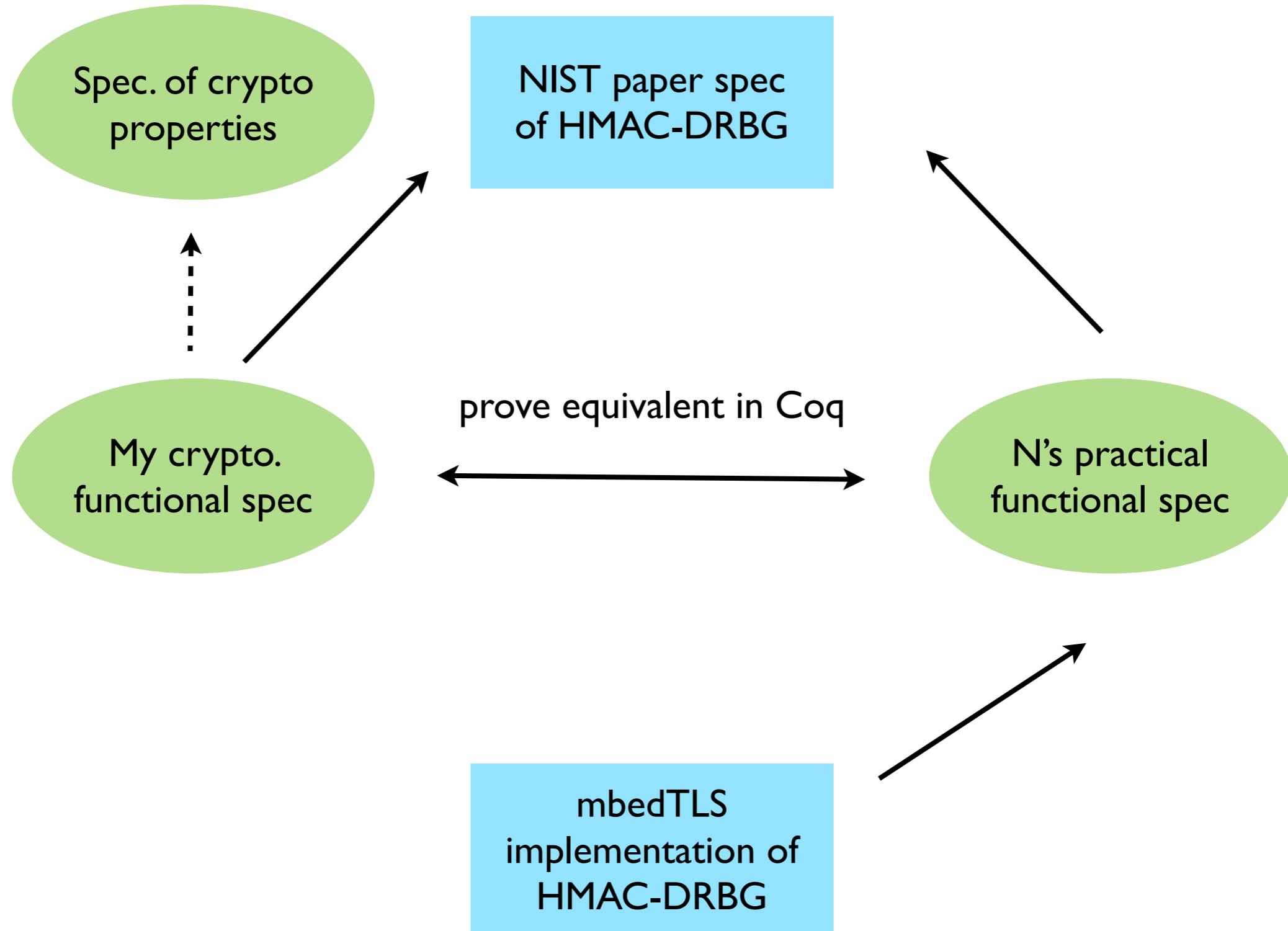
$x \rightarrow y:$
 x implements y

Our project



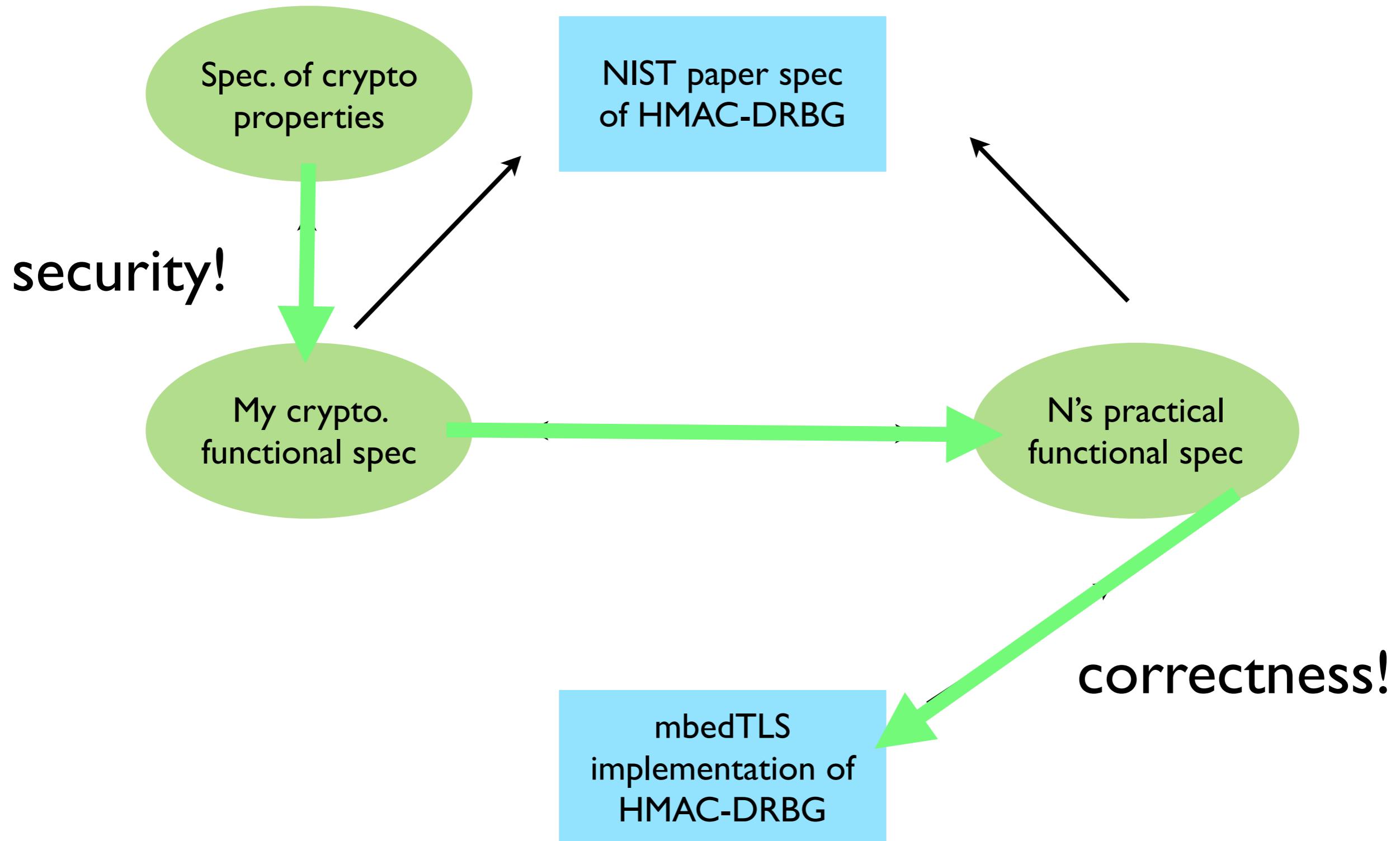
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Our project



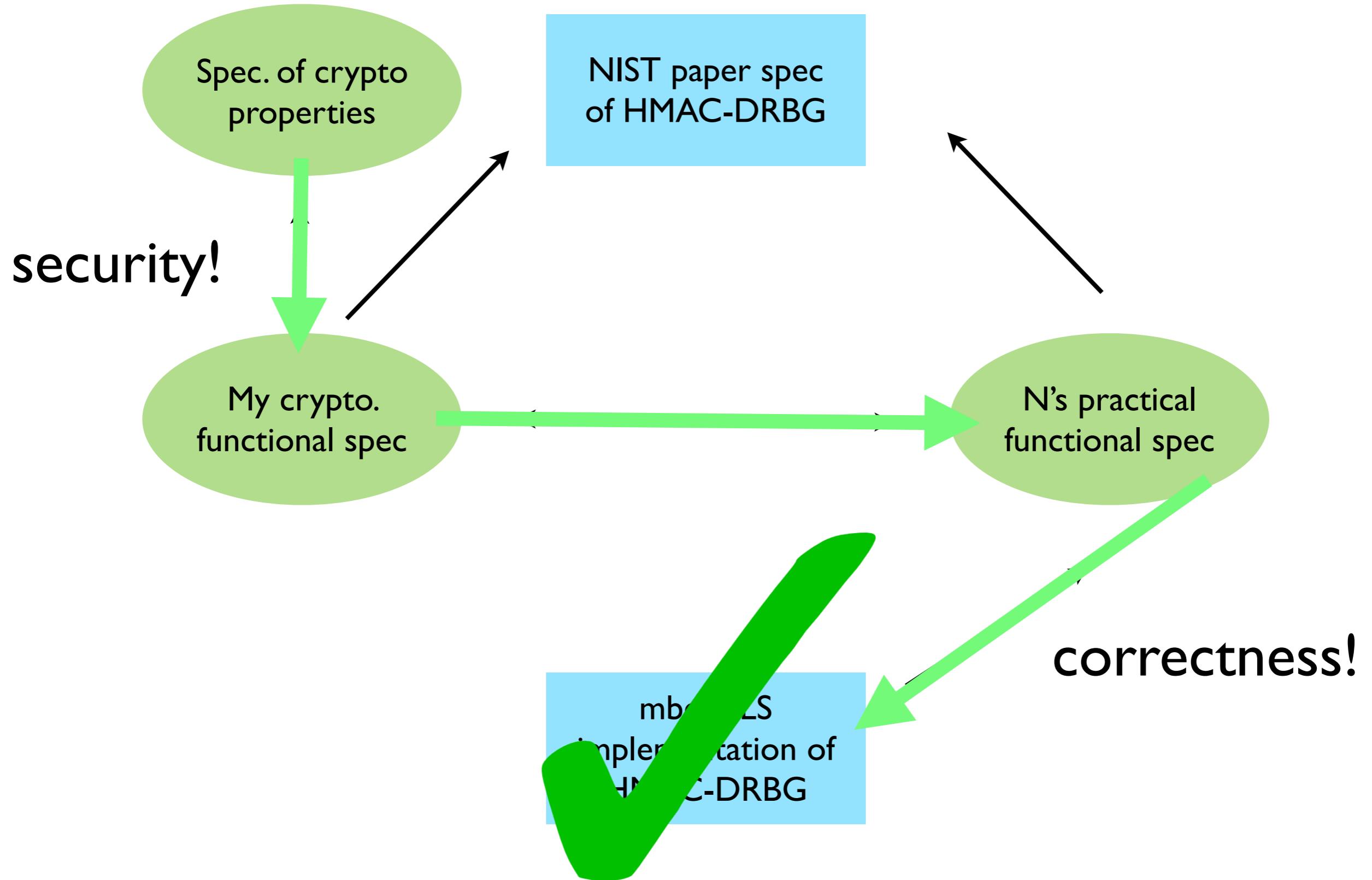
$x \rightarrow y:$
 x implements y

Our project



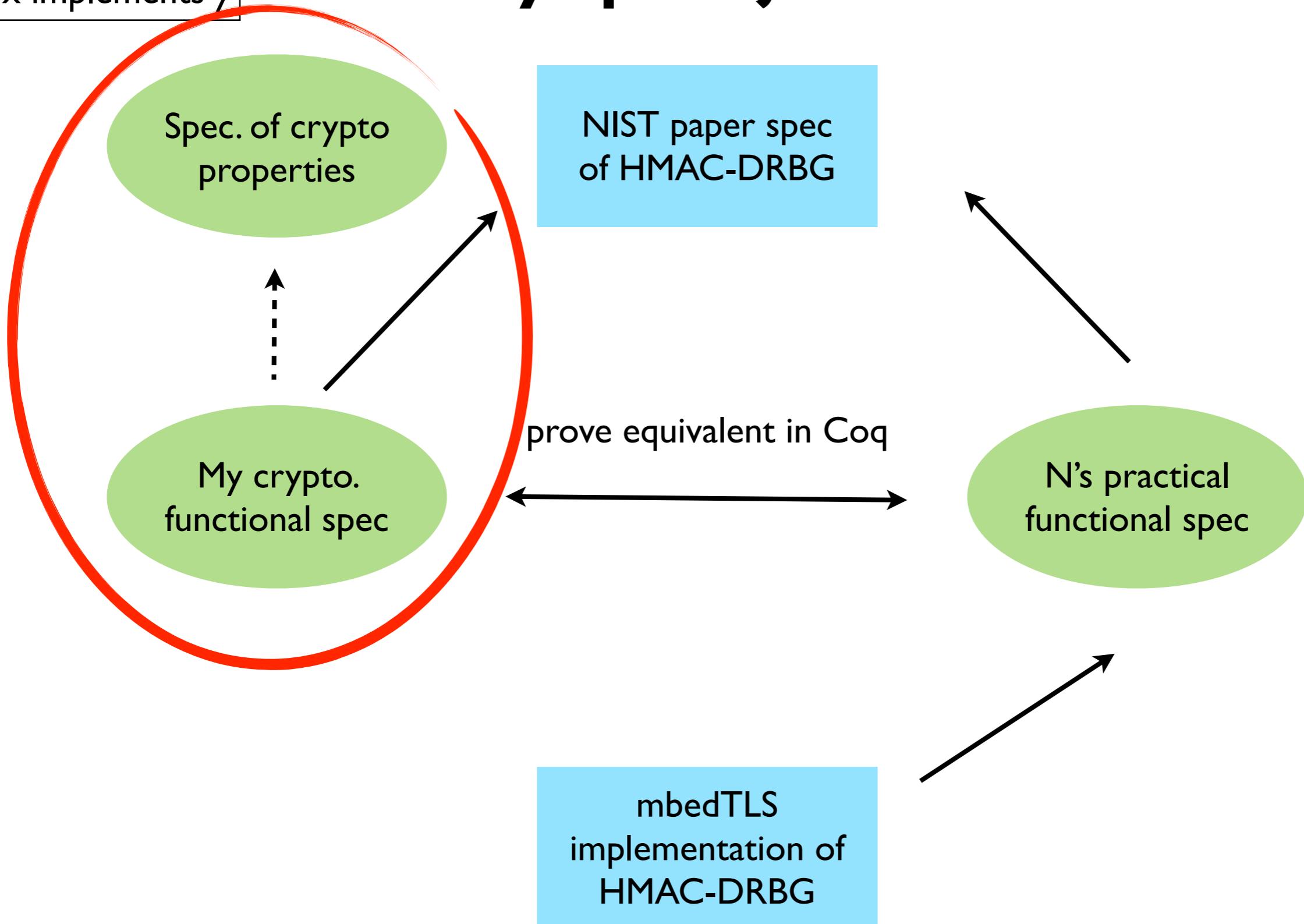
$x \rightarrow y:$
 x implements y

Our project



My project

$x \rightarrow y:$
 x implements y



Security properties of PRGs

- Output indistinguishable from random to a computationally-bounded adversary

Security properties of PRGs

- Backtracking-resistant (compromise at time t does not compromise output from time $< t$)
- Eventually recovers from compromises of internal state

Related work

(there isn't much)

Our group

- Appel (2015) does the first “full formal machine-checked verification of a C program: the OpenSSL implementation of SHA-256.”
- Petcher, Beringer, Ye, and Appel (2015) do the same for HMAC, adding a proof of crypto security depending on SHA

[Verification of a Cryptographic Primitive: SHA-256](#)

[Verified Correctness and Security of OpenSSL HMAC](#)

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hence HMAC-DRBG

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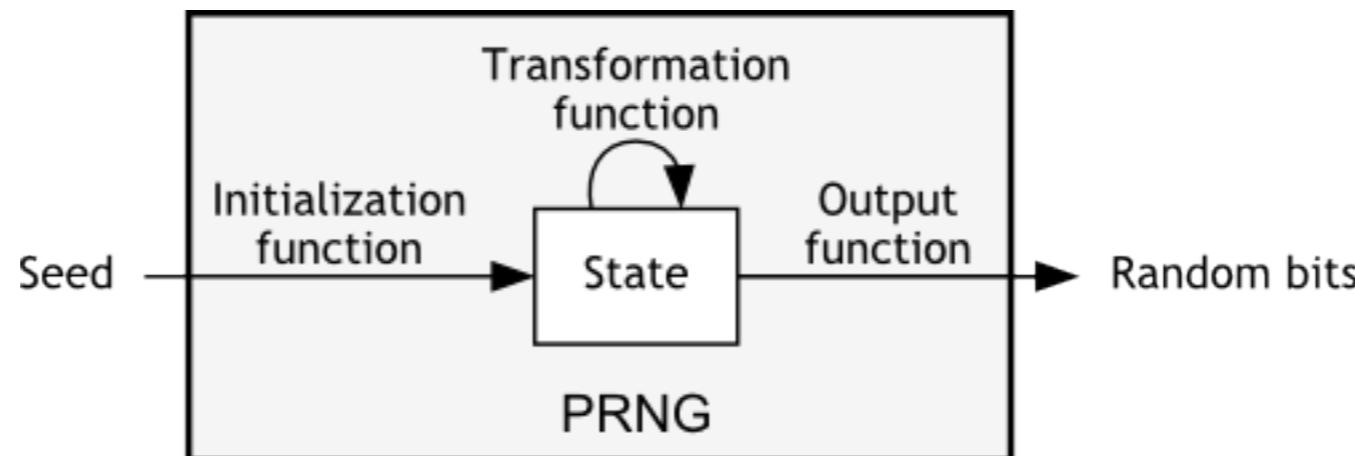
Paper proofs

- One proof by Hirose (2009) about HMAC-DRBG; not peer-reviewed
- Several crypto papers analyze the security of PRGs and propose new security properties, e.g. Dodis et al.

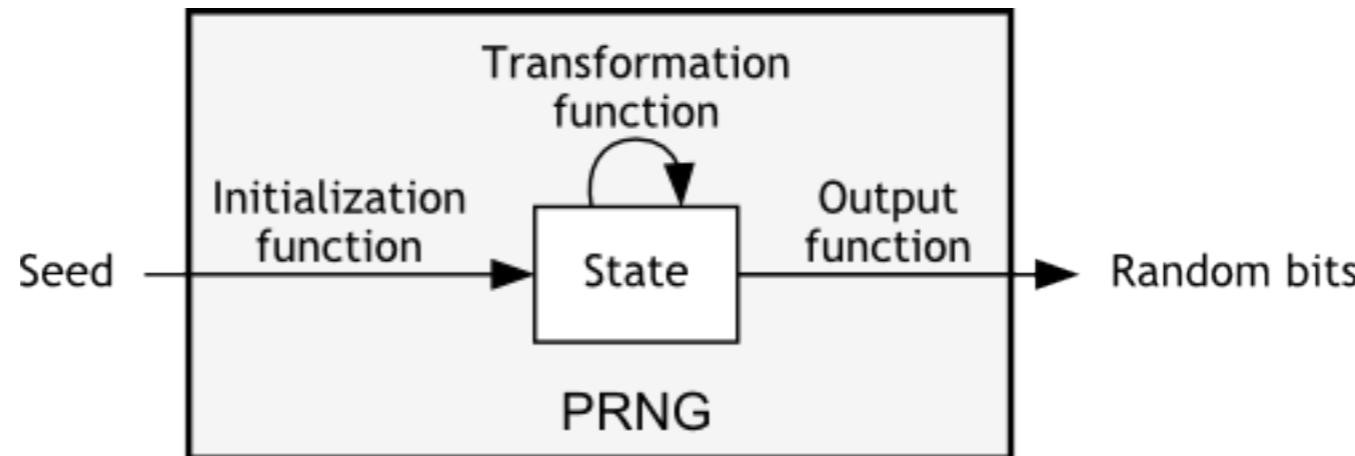
<http://repo.flib.u-fukui.ac.jp/dspace/bitstream/10098/2126/1/art.pdf>
<https://eprint.iacr.org/2013/338.pdf>

PRG internals

Pseudo-random number generator



Pseudo-random number generator



**Instantiate
Generate (bits)
Reseed (add entropy)
Update (internal state)**

Generate (simplified)

Chaining:

K = secret key; V = initialization vector;

H = hash function (e.g. HMAC); \parallel = concatenate

```
rand_bits = H(K, V)           outputs used again as inputs
           || H(K, H(K, V))  
           || H(K, (H(K, H(K, V))))...
```

Generate (simplified)

```
rec loop K V n =
  if n = 0 then ([] , V)
  else
    let (result, V') := loop K V (n-1) in
    let V'' := HMAC K V' in
    (result ++ V'', V'')
```

n blocks of output: recursion

```
fun Generate K V n reseed_ctr =
  if reseed_ctr >= max then reseed_required
  else
    let (bits, V') := loop K V n in
    let (K', V'') := Update K V' in
    (K', V'', bits)
```

PRG run

User/Adversary:

Instantiate,
Generate 10 blocks,
Generate 20 blocks,
Generate 1 block,
Generate 1000000 blocks,
Generate 1 block,
...



Another loop

PRG run

User/Adversary:

Instantiate,
Generate 10 blocks,
 Update K and V
Generate 20 blocks,
 Update K and V
Generate 1 block,
 Update K and V,
Generate 1000000 blocks,
 Update K and V,
 RESEED,
Generate 1 block,
 Update K and V,
...



Complications with
Updating key and Reseed

Prior work

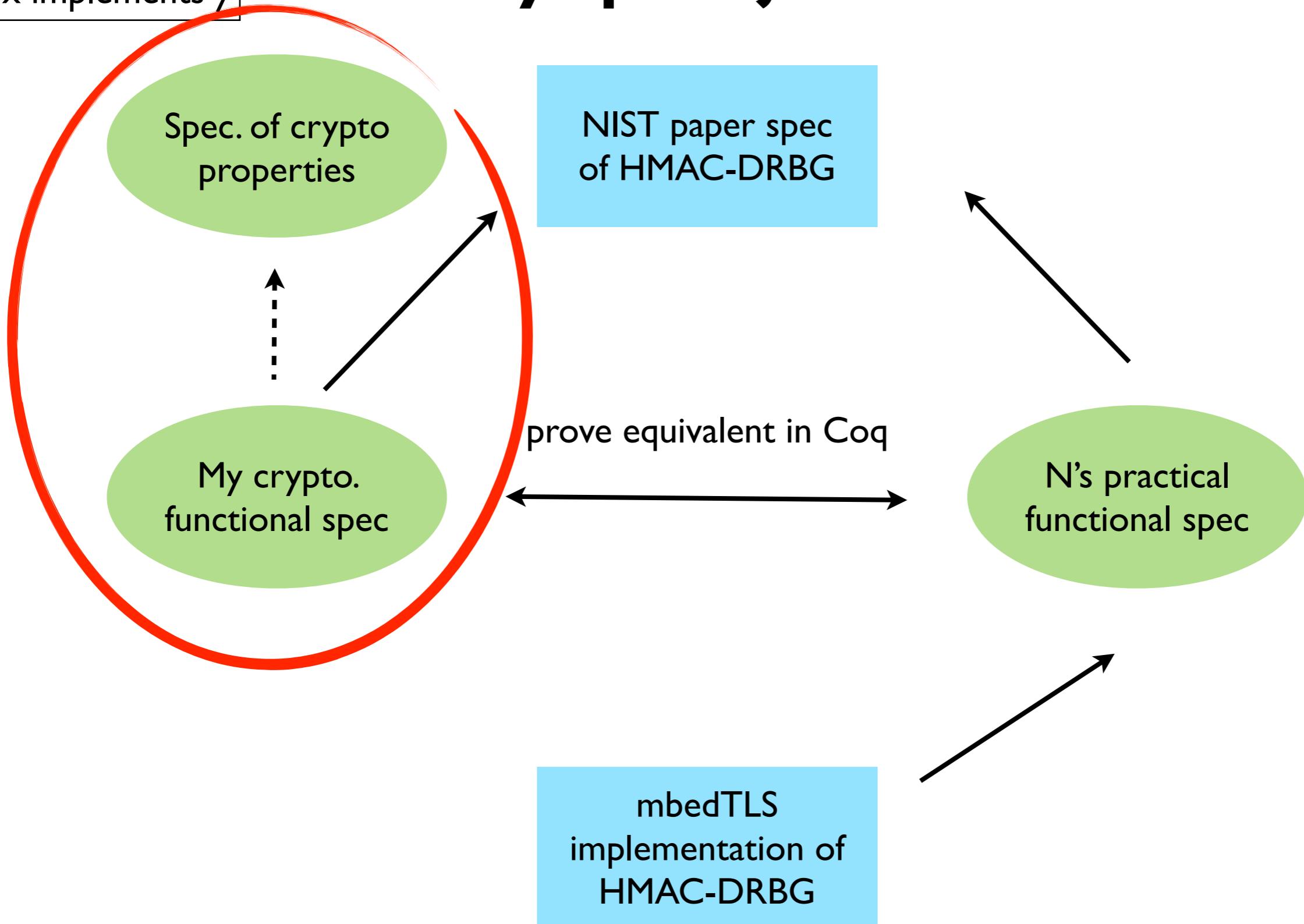
- Proof of indistinguishability for inner loop of PRG
(Generate function): done by collaborator
- Extend to proof of indistinguishability for outer loop of PRG (multiple Generate calls with Update)

Method

- Proofs in the “sequence of games” style
- Bound probability of adversary distinguishing correctly by $1/2 + \text{negligible amount}$
- Done in FCF in Coq, so correctness is verified

My project

$x \rightarrow y:$
 x implements y



Results

Results

- Proved pseudorandomness of simplified HMAC-DRBG on paper
- Mostly done: formally proved pseudorandomness of simplified HMAC-DRBG!

Results

- Total lemmas: 17 main ones, many smaller
- Confident about all of them
- Proved 4 main difficult ones

Results

- Total lines of code: ~2000 (but not done)
- Admitted lemmas: 22 (including medium-sized ones -- confident about all)

Results

- Idea for extending pseudorandomness proof to backtracking resistance
- Negative result: prediction resistance is too hard to prove

To do

- Prove admitted lemmas
- Add features to proof (e.g. additional input)
- Prove backtracking resistance

To do

- Connect it with concrete functional spec
- Write a combined paper

Measure of success

Questions

- How automated? (Very manual.)
- How much effort? (Discussed earlier.)

Questions

- Did we contribute original math? (Yes!)

Measures of success

- What attacks can be definitively ruled out by our verification? What attacks are still possible? (TBD)
- Are the security and formal verification communities excited about using or building on our work? (TBD)

Conclusion

- We (mostly) did it!
- Future work: can others do it for other things?

Thanks!