

# Formally proving crypto properties of pseudorandom number generators

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advised by Andrew Appel and Matt Green

**DILBERT** By SCOTT ADAMS

TOUR OF ACCOUNTING

OVER HERE  
WE HAVE OUR  
RANDOM NUMBER  
GENERATOR.



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NINE NINE  
NINE NINE  
NINE NINE



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ARE  
YOU  
SURE  
THAT'S  
RANDOM?

THAT'S THE  
PROBLEM  
WITH RAN-  
DOMNESS:  
YOU CAN  
NEVER BE  
SURE.



- 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



RNG

1011100110101011000010110010000011111011110001111100110111010000000010

# Pseudo-random number generator

1100101



PRG



1111110111110100101011001101000100011110111111010111000101010100011000

# Pseudo-random number generator

1100101



PRG



11111101111110100101011001101000100011110111111010111000101010100011000

≈

00101110011010101100001011001000001111101111000111110011011101000000001

# Pseudo-random number generator

1100101



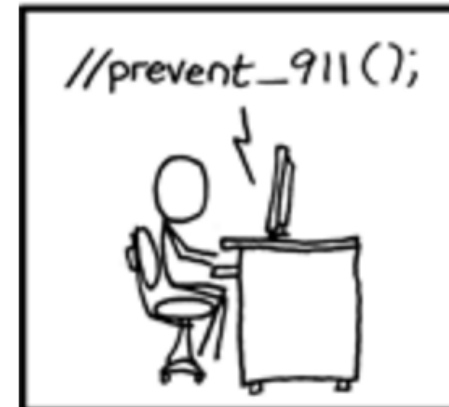
PRG



11111011111010010101100110100010001111011111010111000101010100011000  
00101110011010101100001011001000001111101111000111110011011101000000001

! ≈

# 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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and **cryptographic security** of a  
widely-used implementation of a PRG

↑  
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

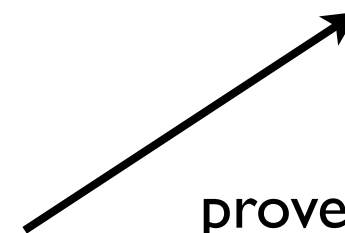
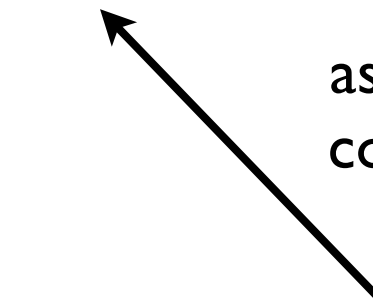
NIST paper spec  
of HMAC-DRBG

assume  
correct

N's practical  
functional spec

mbedTLS  
implementation of  
HMAC-DRBG

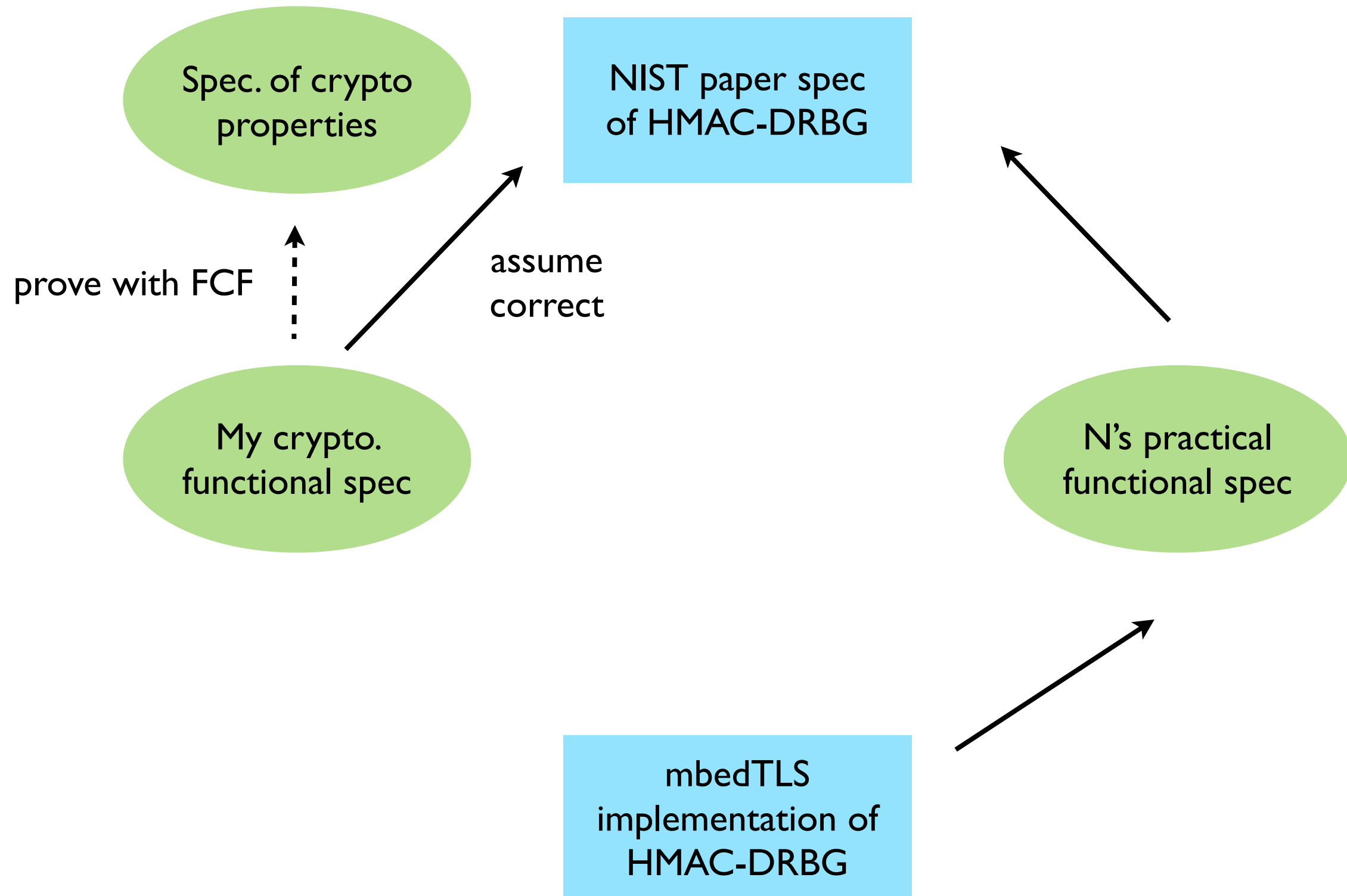
prove with VST





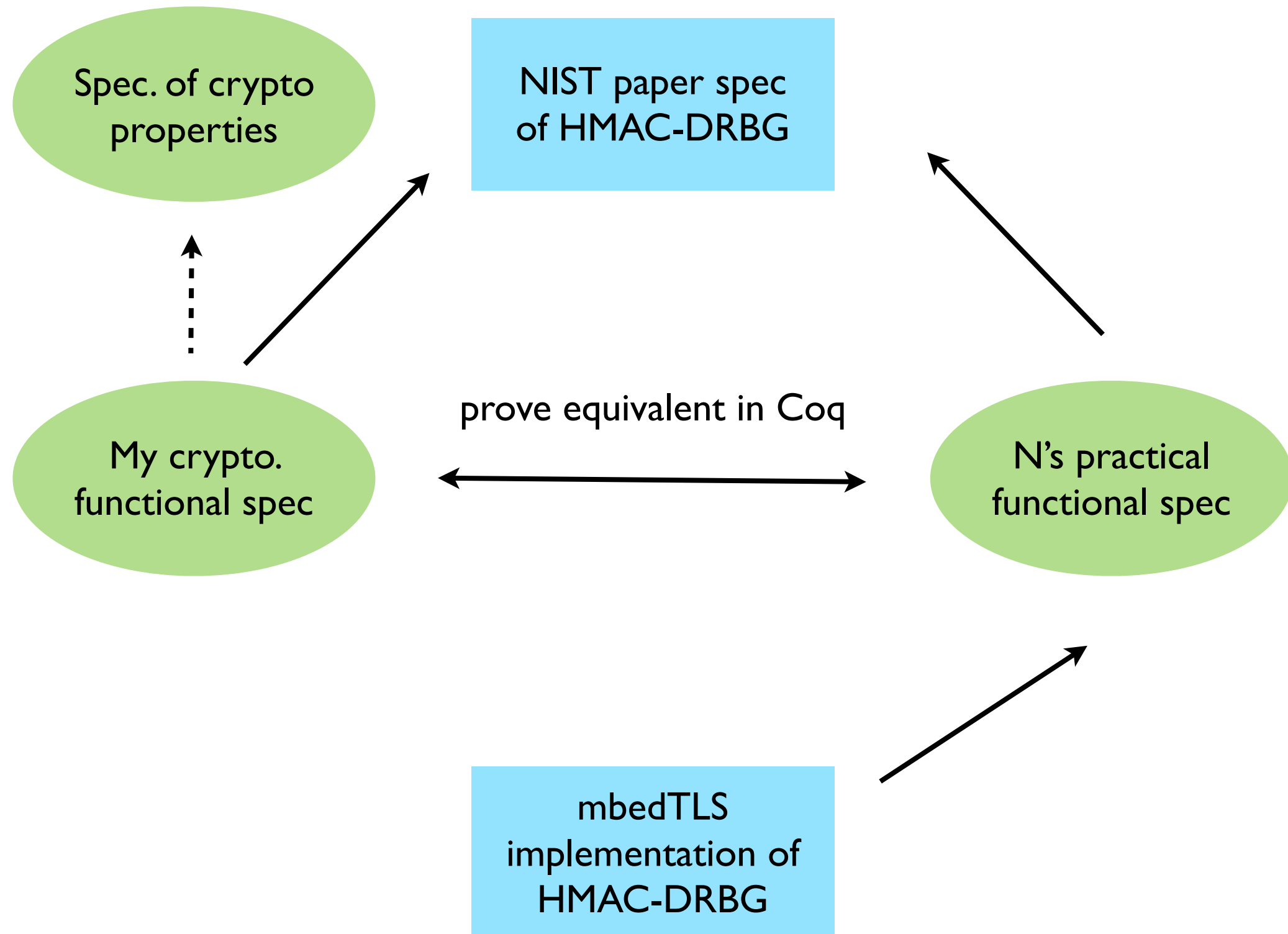
$x \rightarrow y$ :  
x implements y

# Our project



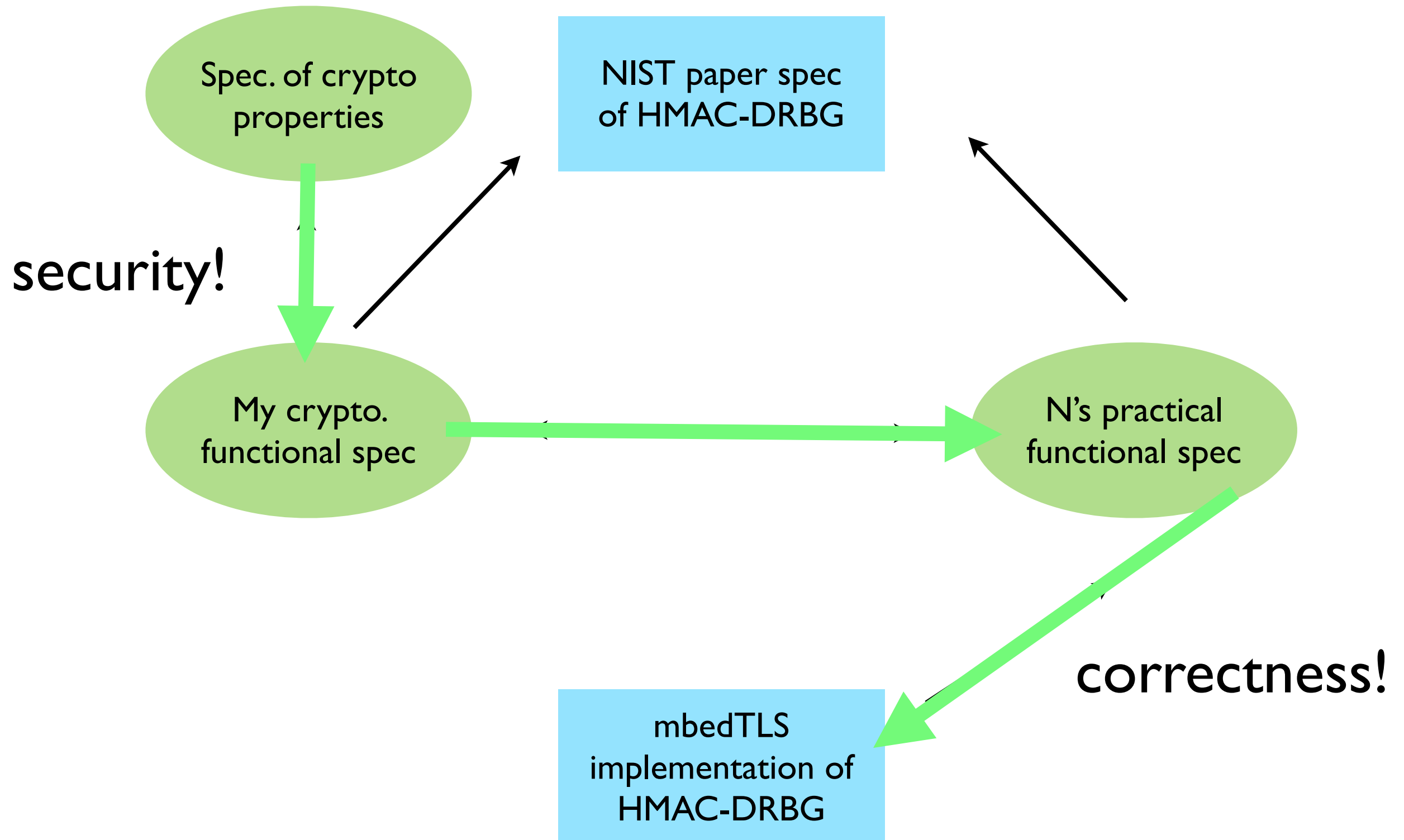
$x \rightarrow y$ :  
x implements y

# Our project



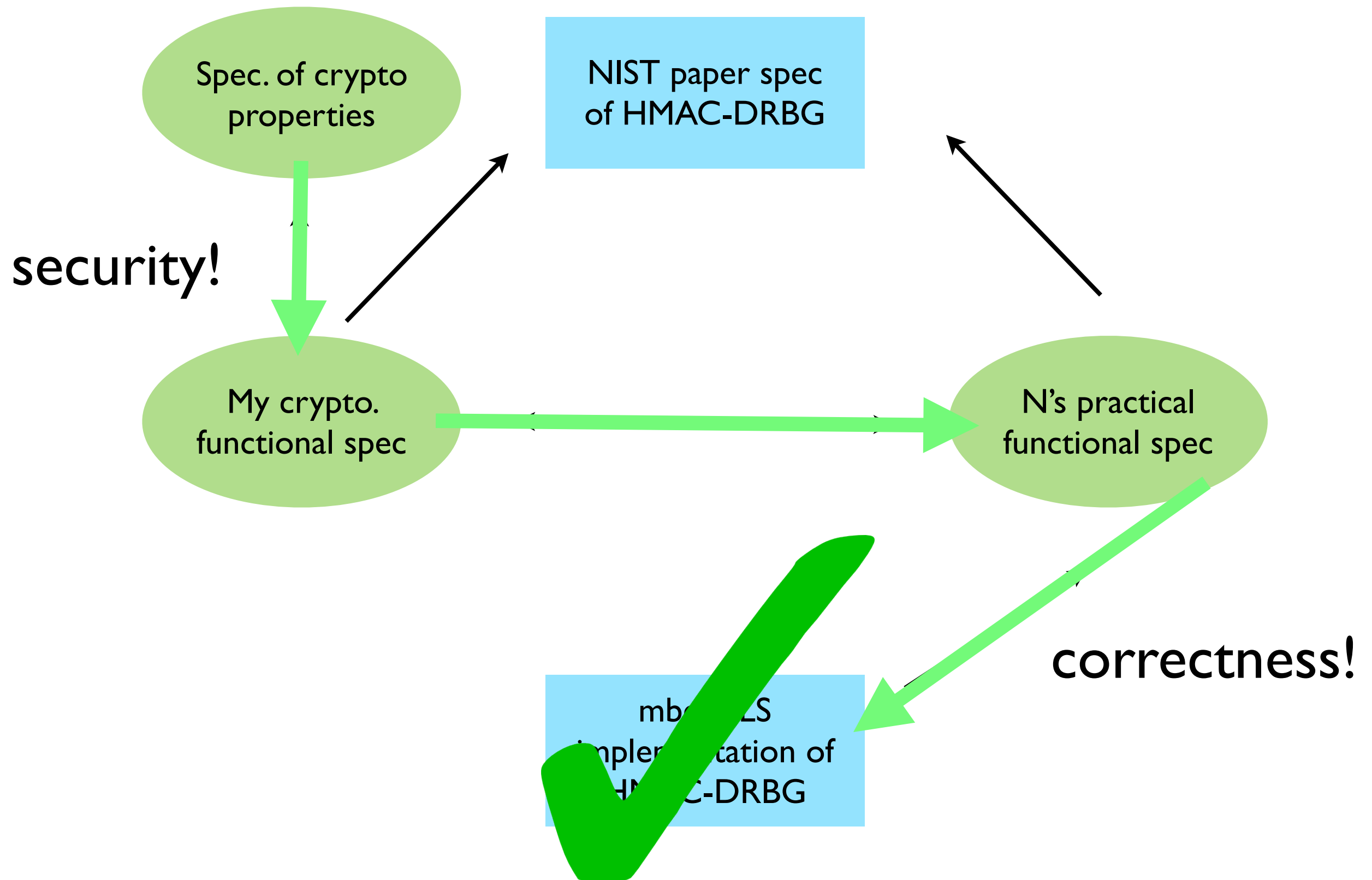
$x \rightarrow y$ :  
x implements y

# Our project



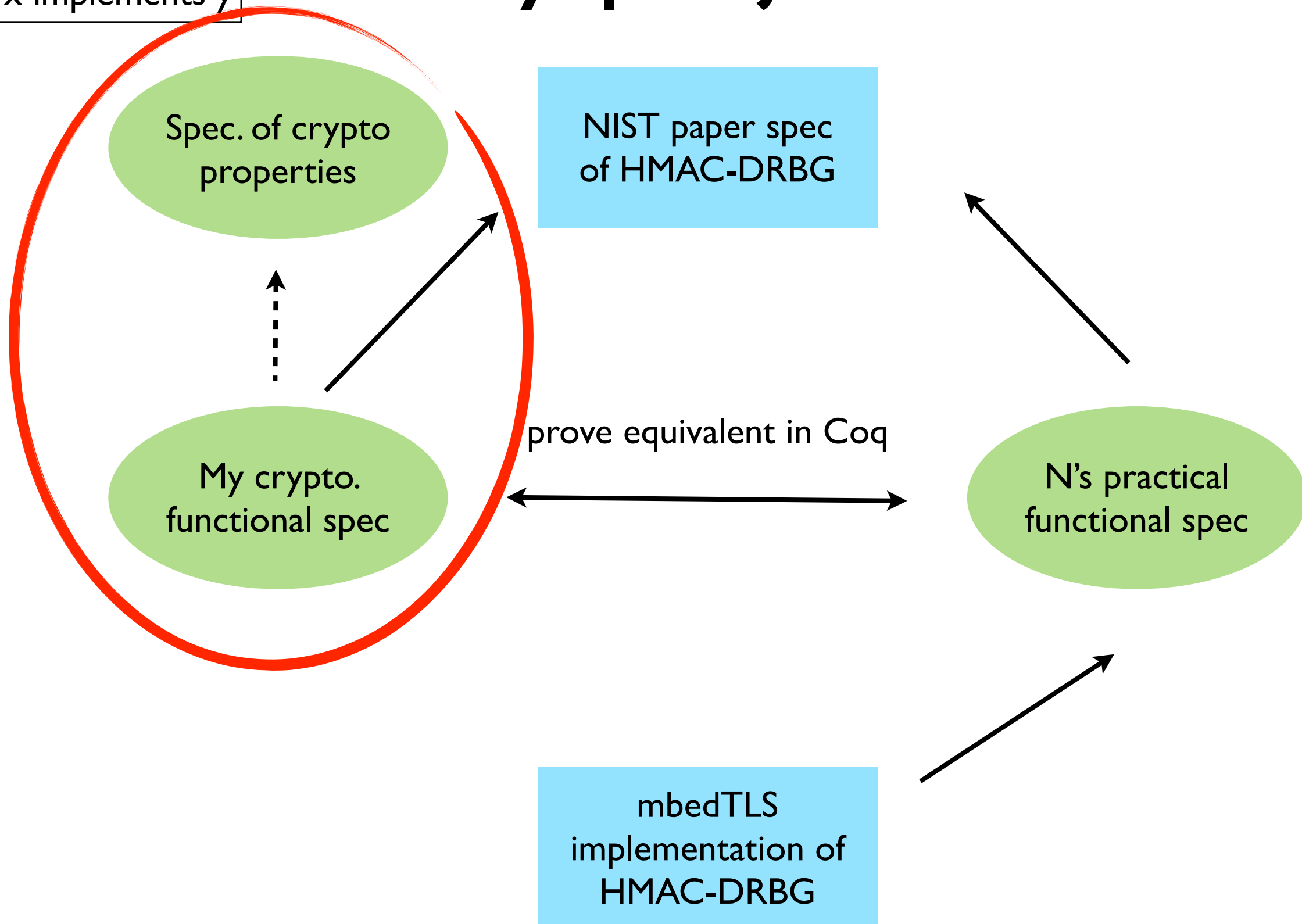
$x \rightarrow y$ :  
x implements y

# Our project



$x \rightarrow y$ :  
x implements y

# My project



# 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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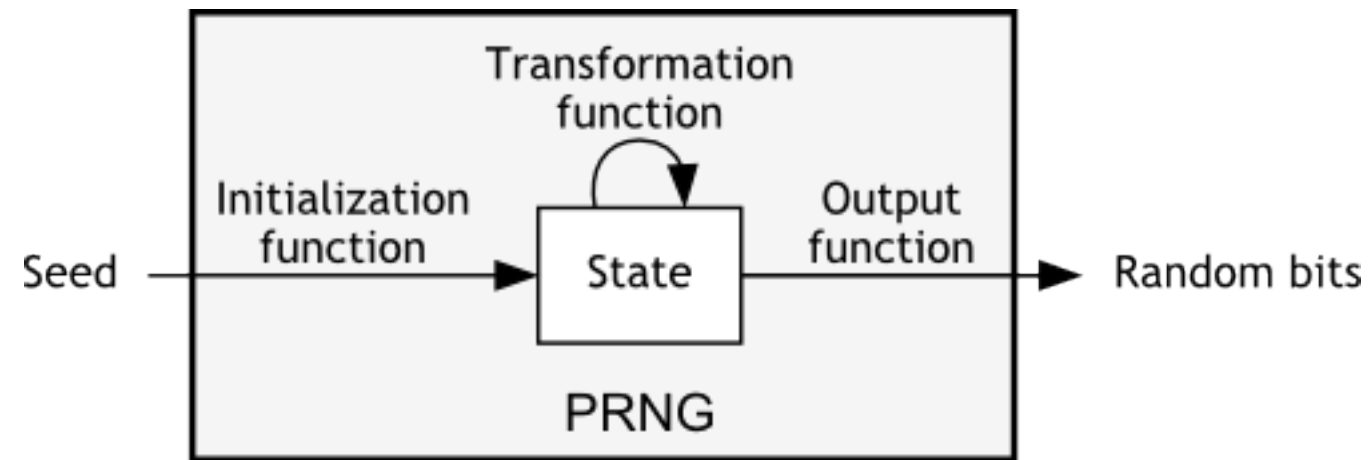
# Paper proofs

- 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.

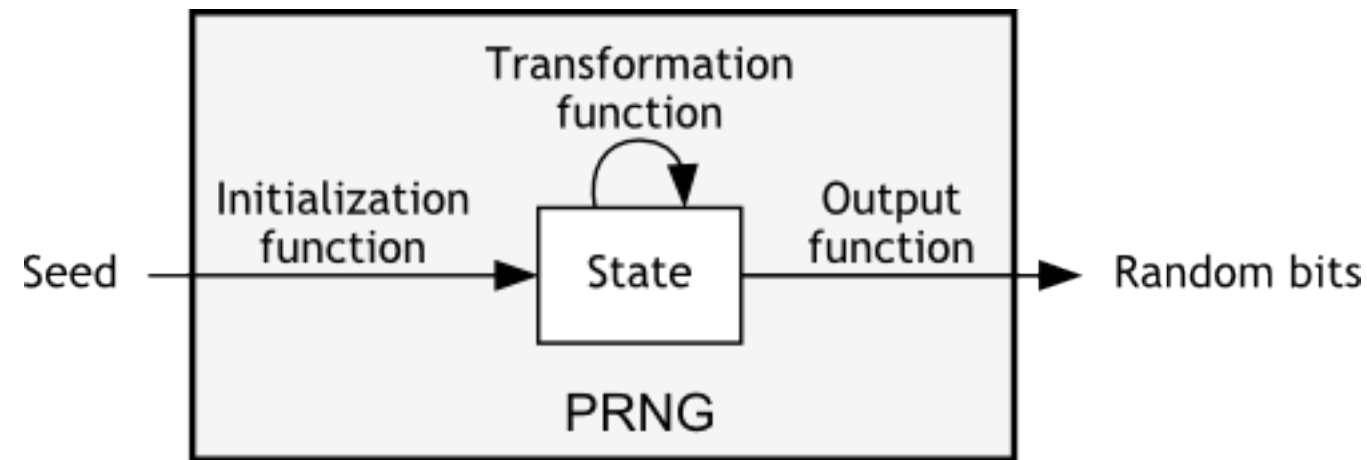
<http://repo.flit.u-fukui.ac.jp/dspace/bitstream/10098/2126/1/art.pdf>  
<https://eprint.iacr.org/2013/338.pdf>

# 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);  $||$  = concatenate

rand\_bits =

$H(K, V)$  ← outputs used again as inputs

$|| H(K, H(K, V))$

$|| H(K, (H(K, H(K, V)))) \dots$

# 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 10000000 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 10000000 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

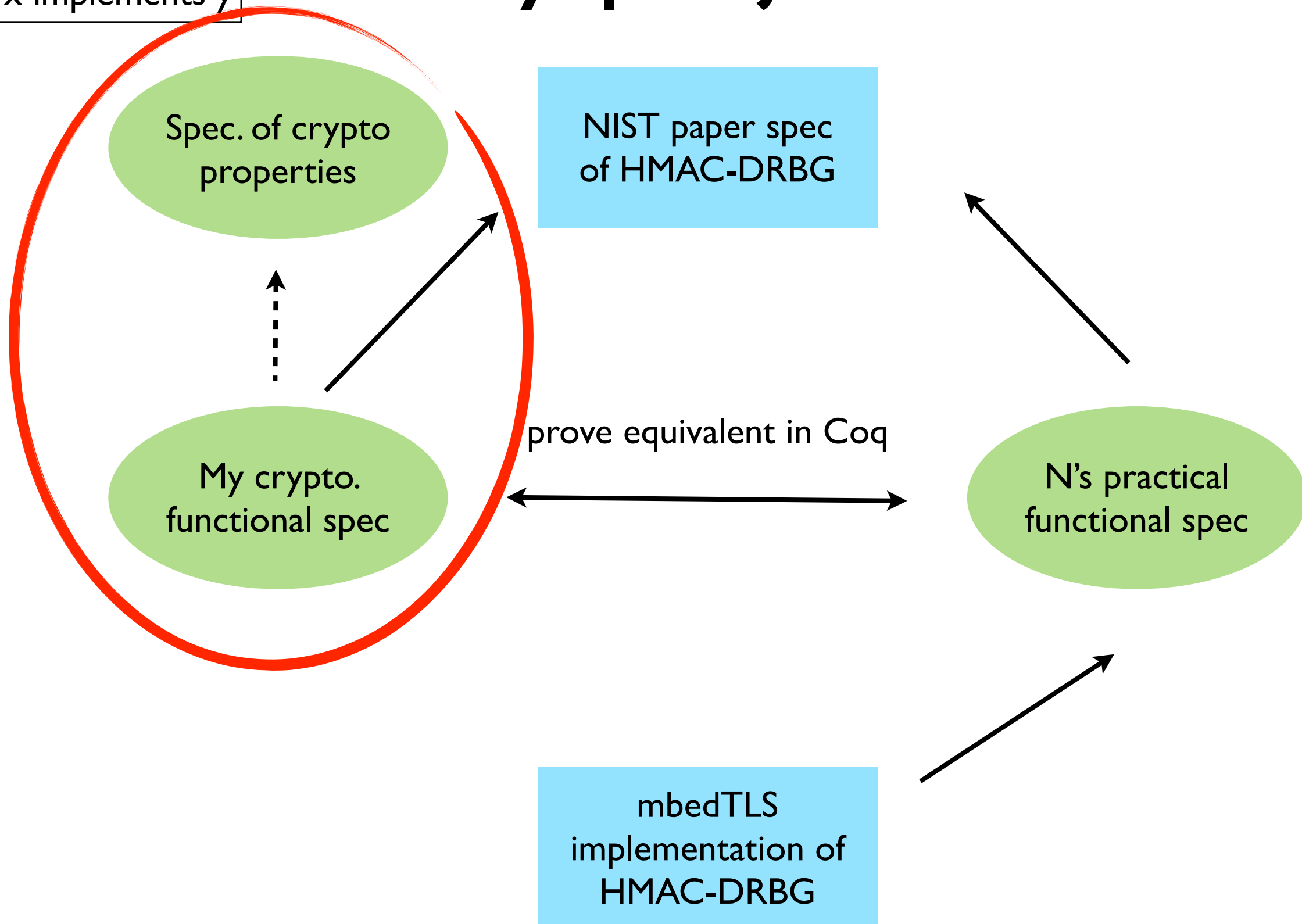
- Extend to proof of indistinguishability for outer loop of PRG (multiple Generate calls with Update)

# 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

$x \rightarrow y$ :  
x implements y

# My project



# 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!**