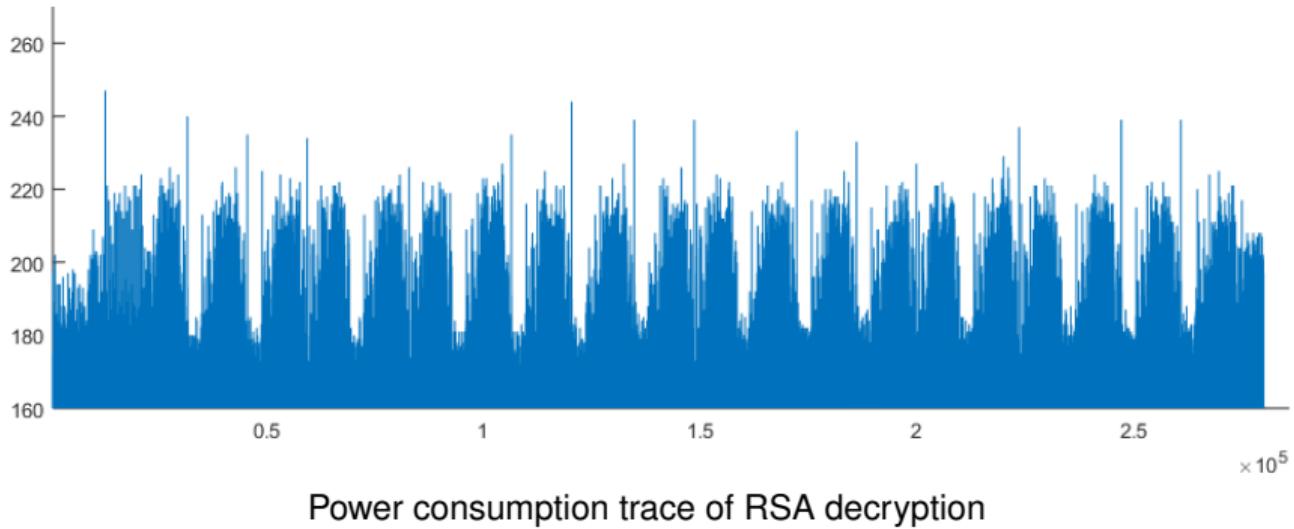


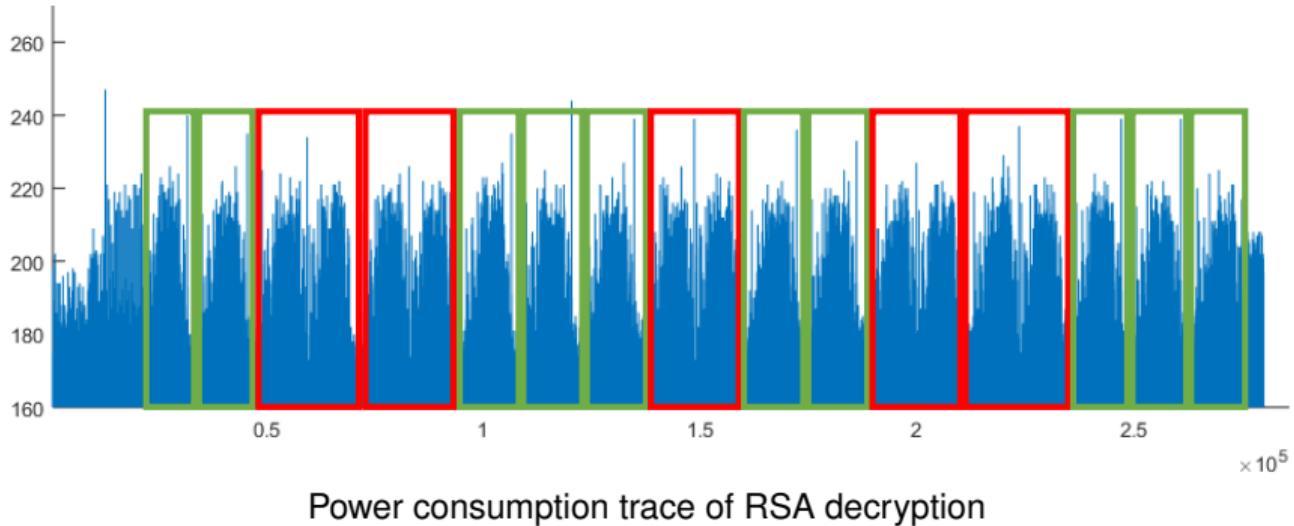
# More Practical Single-Trace Attacks on the Number Theoretic Transform

Peter Pessl, Robert Primas  
Graz University of Technology  
LATINCRYPT 2019, October 02

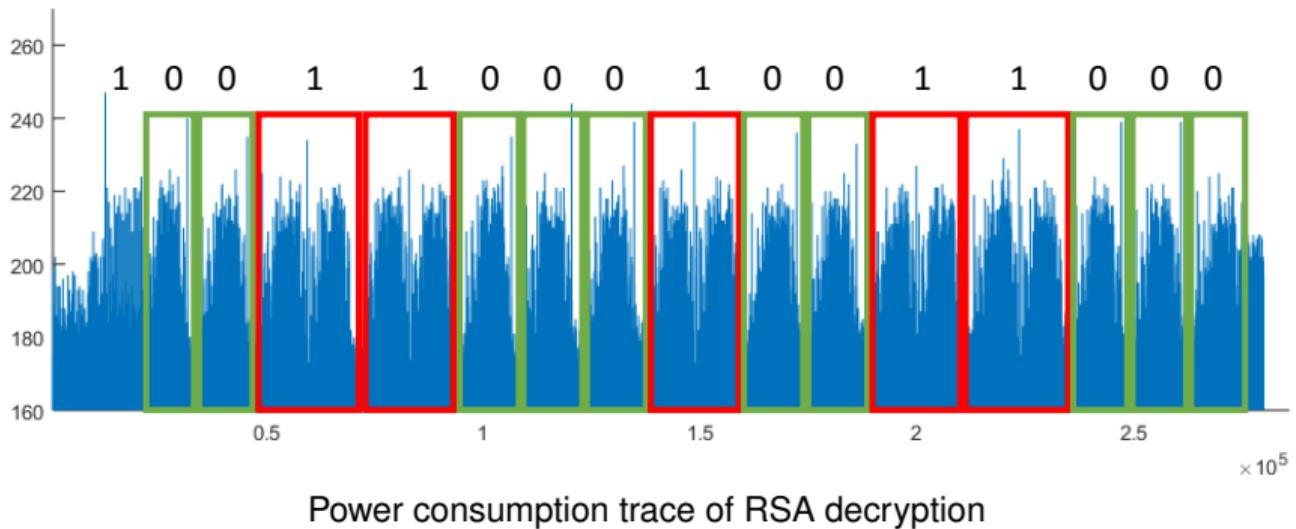
# Public-Key Crypto and Side-Channel Attacks



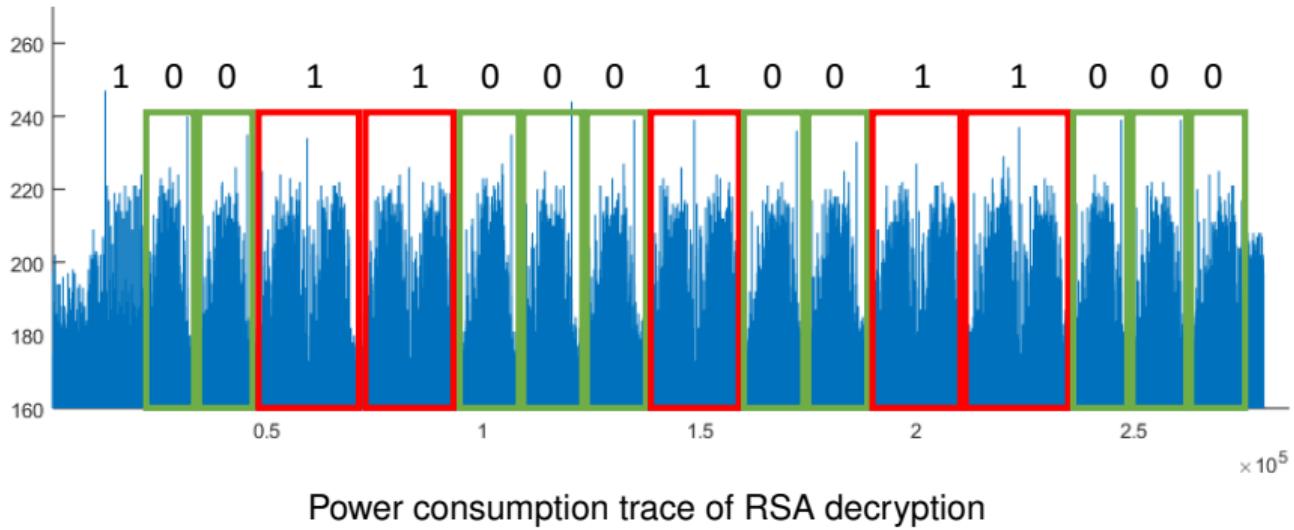
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Power consumption trace of RSA decryption

Single-trace attacks are still a prime threat!

# But RSA is old news anyway...

- Lattice-based cryptography
  - promising post-quantum replacement
  - implementations: fast and *constant time / control flow*
- Do we still need to worry about single-trace attacks?
  - no more instruction leakage
  - protection efforts towards differential (multi-trace) attacks

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- Our previous work: single-trace attack on the NTT
  - **Number Theoretic Transform**, common in many lattice schemes
  - combine *template attacks* (device profiling) with *belief propagation*
- but...
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Can we do better?

# Our Contribution

- Improve upon previous attack
  - several improvements to belief propagation in this context
  - change targets: encryption instead of decryption
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# Lattice-based Encryption (LPR, NewHope, Kyber, . . . )

"Noisy ElGamal" with polynomials in  $\mathbb{Z}_q[x]/\langle x^n + 1 \rangle$

**Key Generation:** generate small *error polynomials*  $s, e$

$$t = a \cdot s + e$$

$$\text{pk} = (a, t), \text{ sk} = s$$

**Encryption:** generate small *error polynomials*  $r, e_1, e_2$

$$c_1 = a \cdot r + e_1$$

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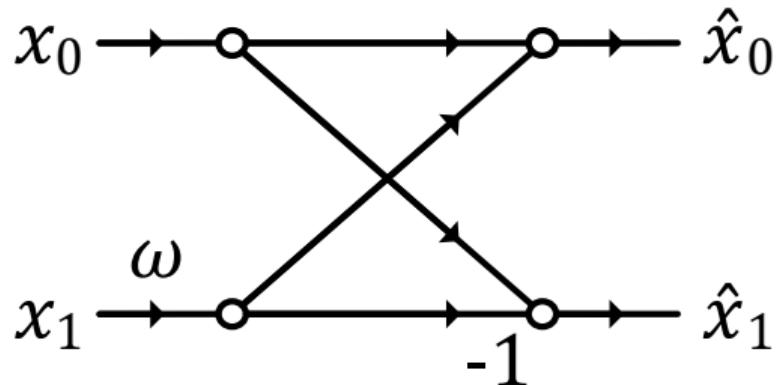
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- Naive polynomial multiplication:  $\mathcal{O}(n^2)$
- Better: Number Theoretic Transform (NTT)
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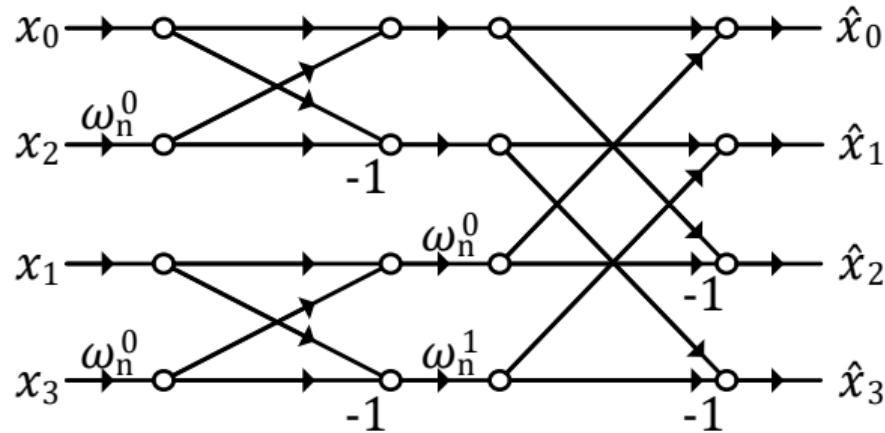
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# Butterfly



Butterfly = 2-coefficient NTT

# Butterfly Network



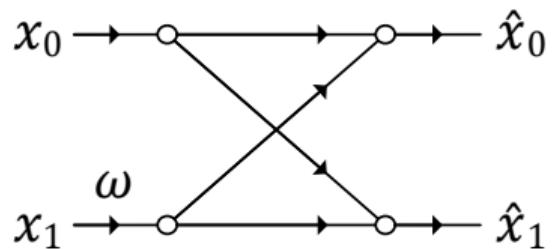
4-coefficient NTT

# Previous Single-Trace Attack on the NTT

Recover secret NTT input with:

## 1. Template matching

- Profile power consumption of mult.
- Match profiles (templates) for probability distribution

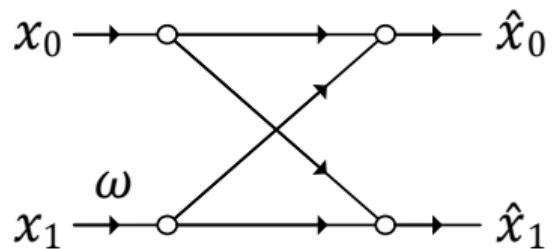


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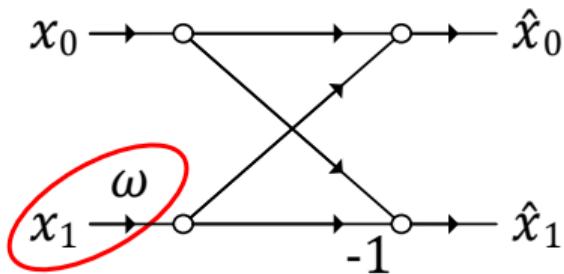


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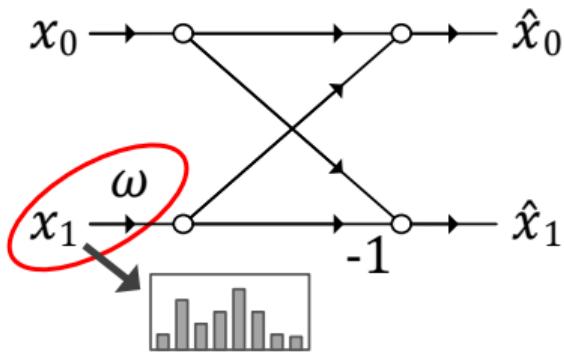


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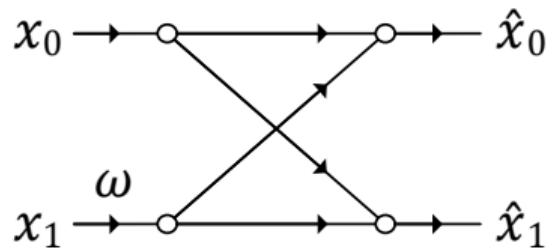


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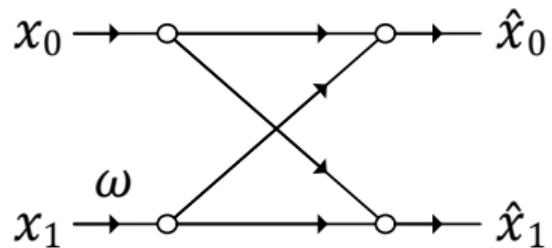


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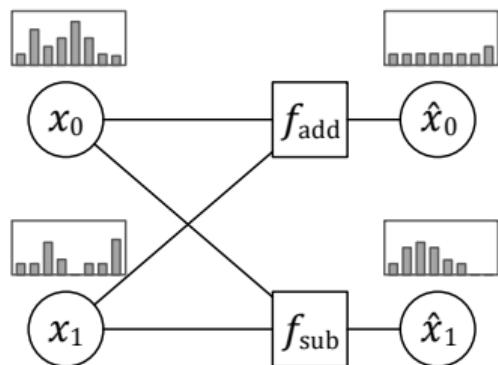


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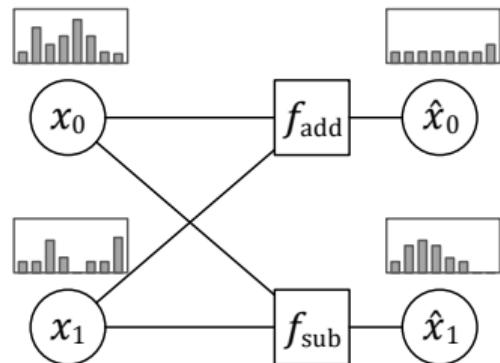


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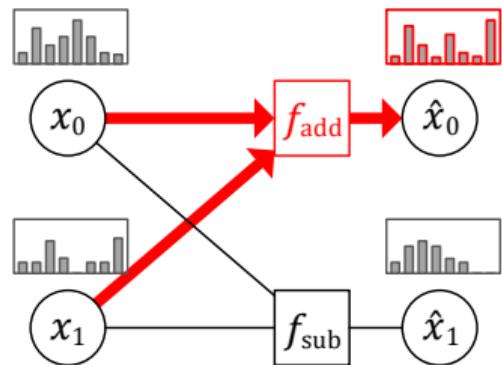


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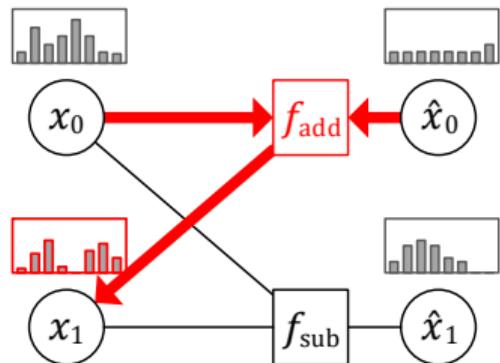


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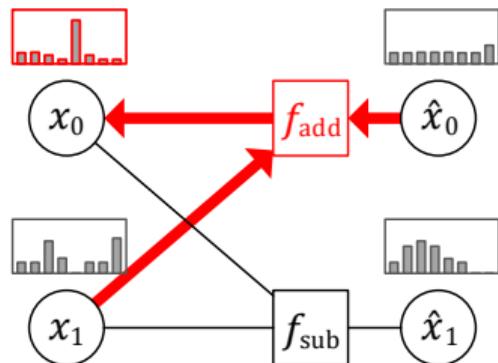


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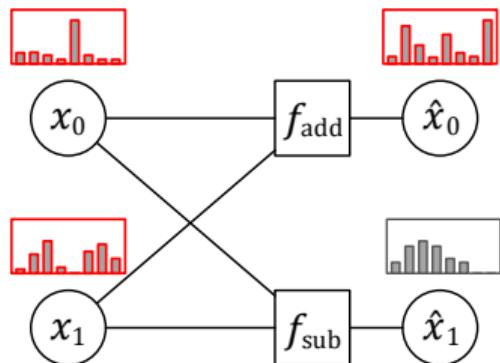


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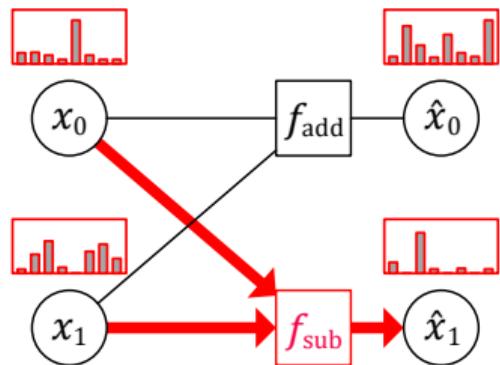


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- Evaluation on non-constant-time implementation
  - timing information not needed per se
  - ...but still aids attacks
- Requires powerful attacker
  - $\approx$  1 million input combinations for modular multiplication
  - each one requires multivariate template
  - ...very high templating effort

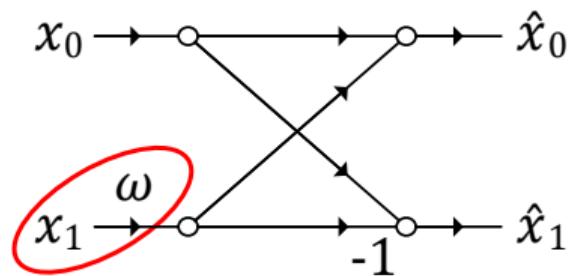
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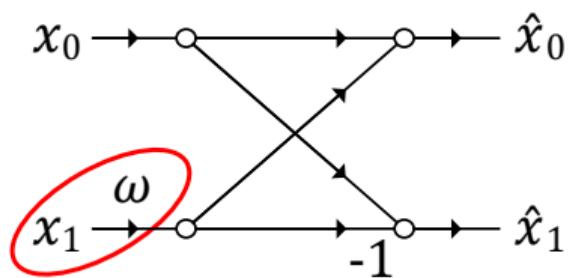
Previously



Target multiplication  
1 million multivariate templates

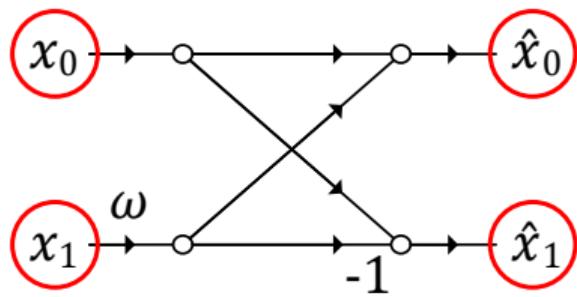
# Decreased Templating Effort

Previously



Target multiplication  
1 million multivariate templates

Now



Target memory loads and stores  
14 univariate Hamming-weight templates

# Are we done?

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no timing information + simpler templates



attack fails!

# Changing Targets

## Decryption

$$m \approx c_2 - \text{INTT}(\text{NTT}(s) \circ \text{NTT}(c_1))$$

Recover INTT input, compute  $s$

INTT input:  $[0, q - 1]^n$

## Encryption

$$c_1 = \text{INTT}(\text{NTT}(a) \circ \text{NTT}(r)) + e_1$$

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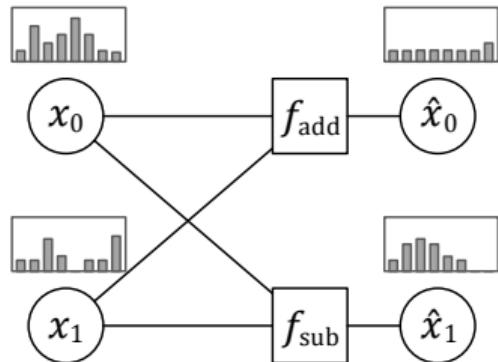
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Attack simulations already work, but we can do better...

# Belief Propagation and Loops

Information flow:

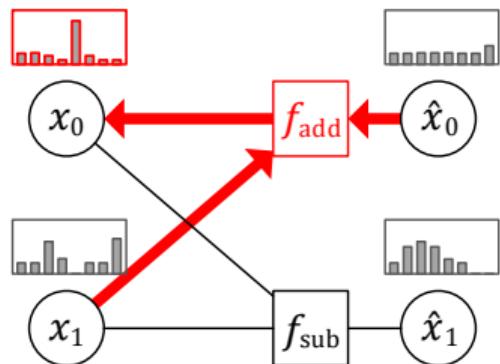
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- Positive feedback loop
  - overconfidence, non-convergence
  - short loop, deterministic operations



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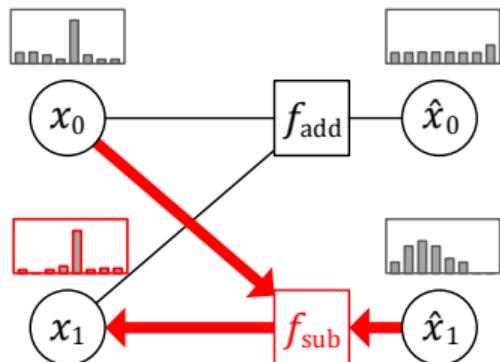
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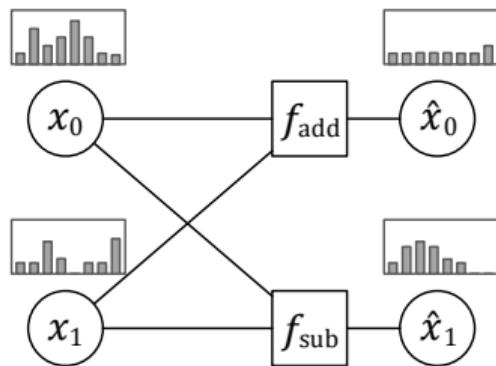
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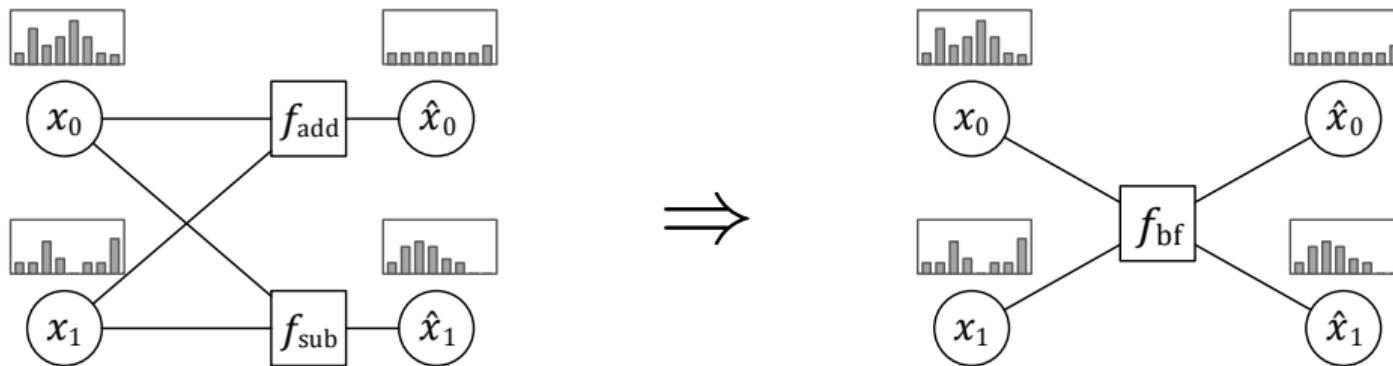
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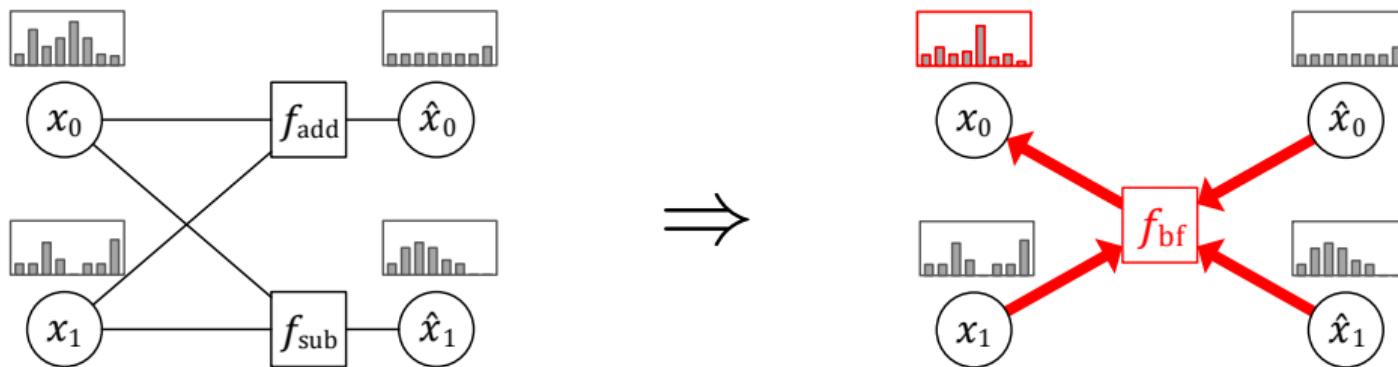
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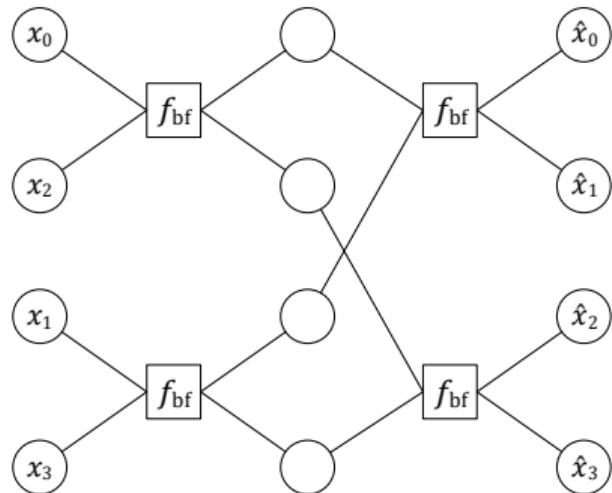
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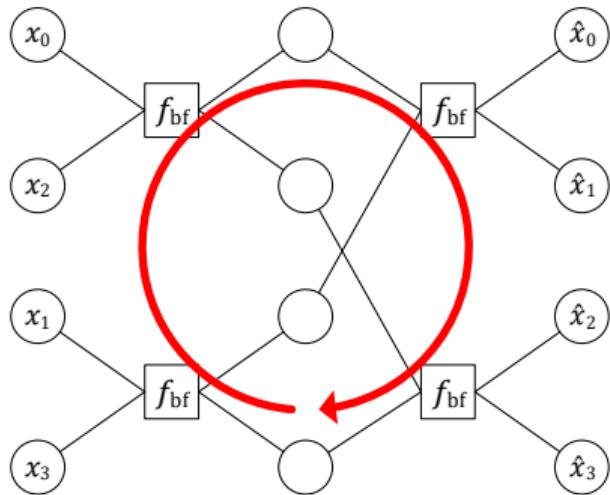


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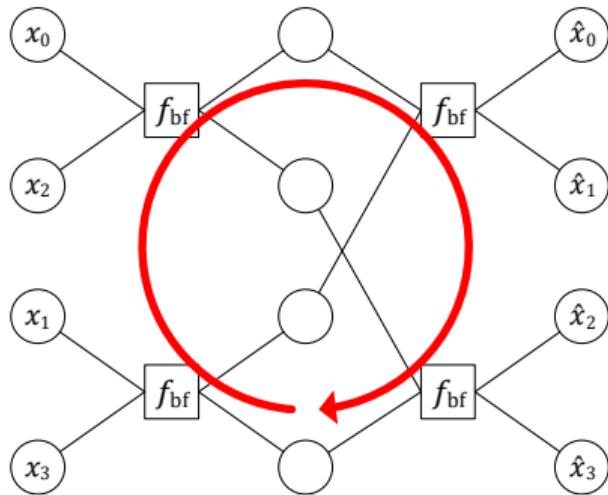
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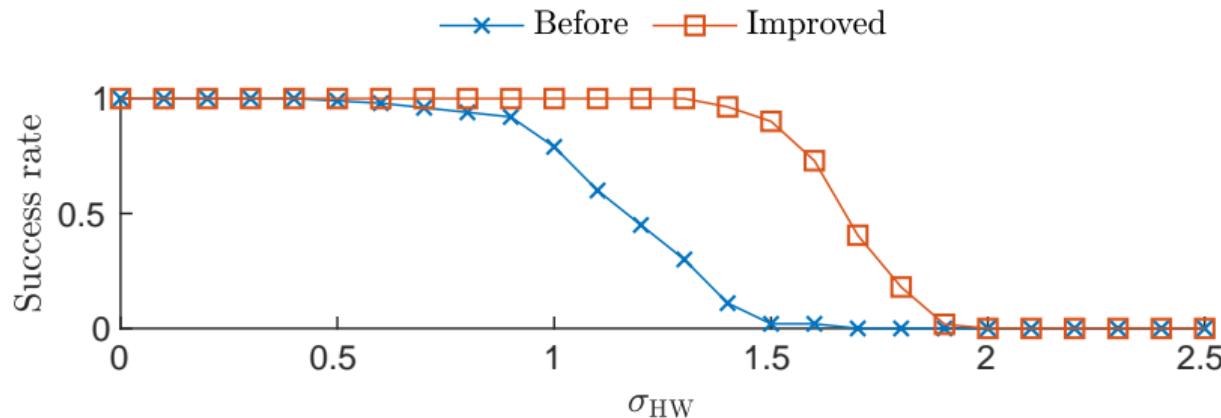
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NTT with 4 coefficients  
Still, shortest loops eliminated

# Attack Simulations

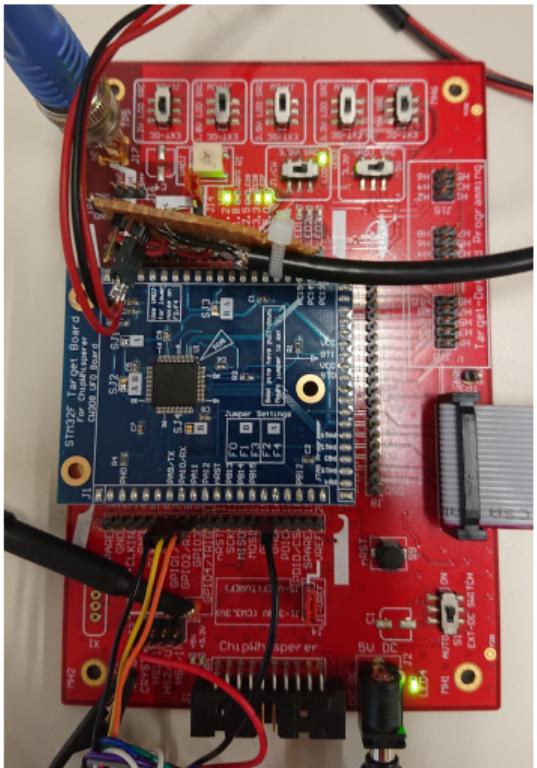
- Leakage simulations
  - Hamming-weight with Gaussian noise
- Tripling of  $\sigma^2$  (SNR)



# Attacking a Real Device

## Power Analysis of an ARM Cortex M4

- ASM-optimized constant-time Kyber
- Profiling: 213 univariate HW templates
- Attack: matching and run BP
- Lattice reduction for error correction
- Overall success rate: 95%



# More Results

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