

# Quantum to Classical Randomness Extractors

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Full version preprint available at  
[arXiv:1111.2026v3](https://arxiv.org/abs/1111.2026v3)



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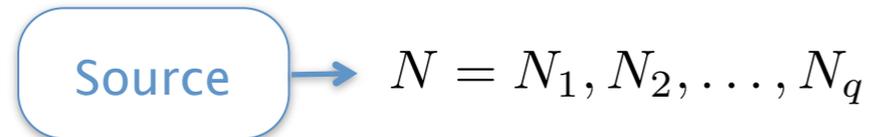
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- Main Contribution: Quantum to Classical Randomness Extractors
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- Entropic Uncertainty Relations with Quantum Side Information
- Conclusions / Open Problems

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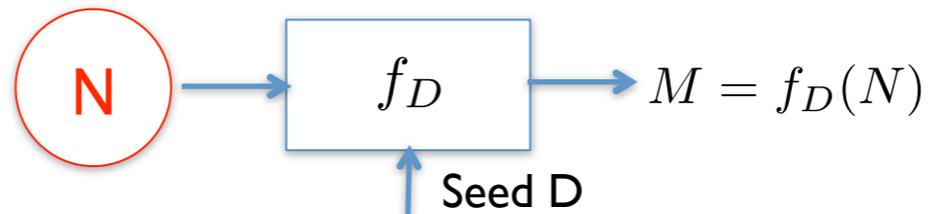
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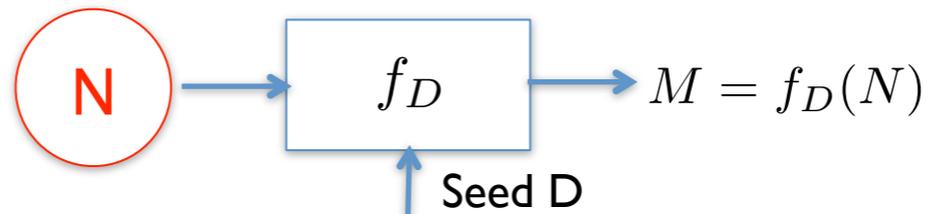
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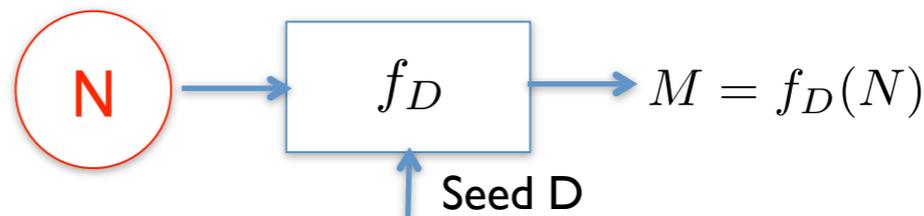
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- Applications in information theory, cryptography and computational complexity theory [1,2].

[1] Nisan and Zuckerman, JCSS 52:43, 1996

[2] Vadhan, <http://people.seas.harvard.edu/~salil/pseudorandomness/>

# Classical to Classical (CC)-Randomness Extractors (II)

- Deal with prior knowledge (trivial for classical side information [3]), in general problematic for quantum side information [4]!  
Source described by classical-quantum (cq)-state:

$$\rho_{NE} = \sum_n p_n |n\rangle\langle n|_N \otimes \rho_E^n.$$

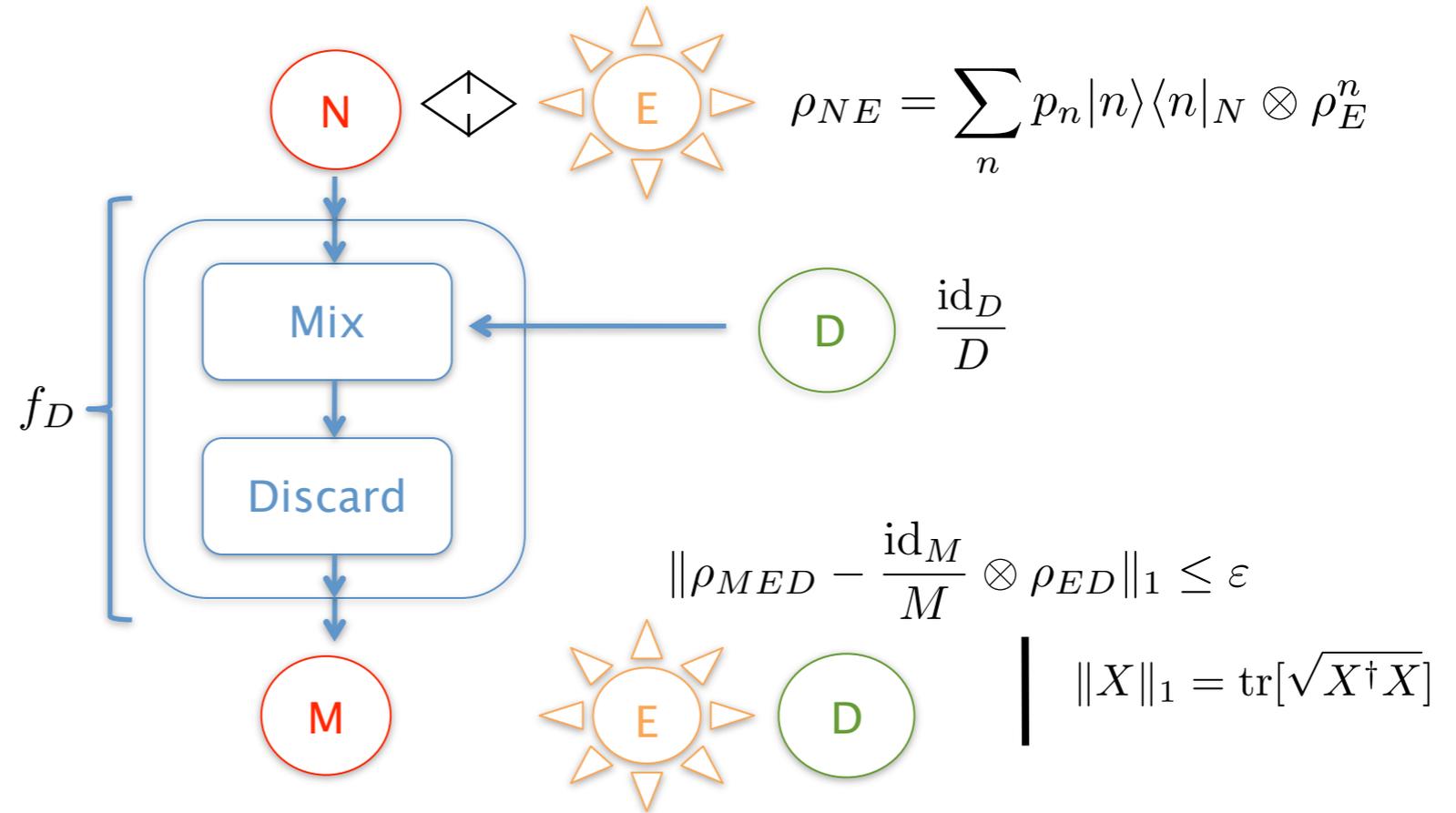
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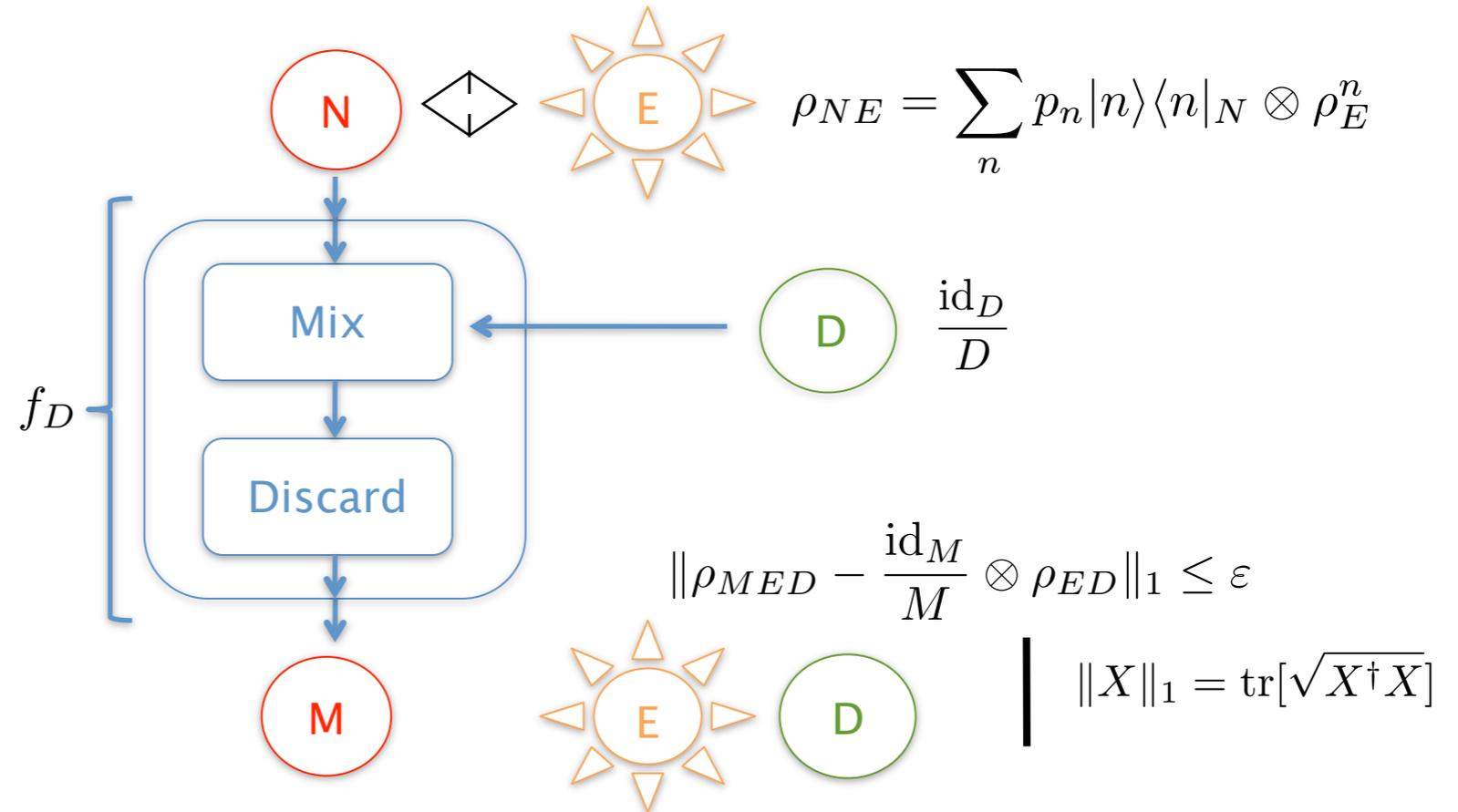
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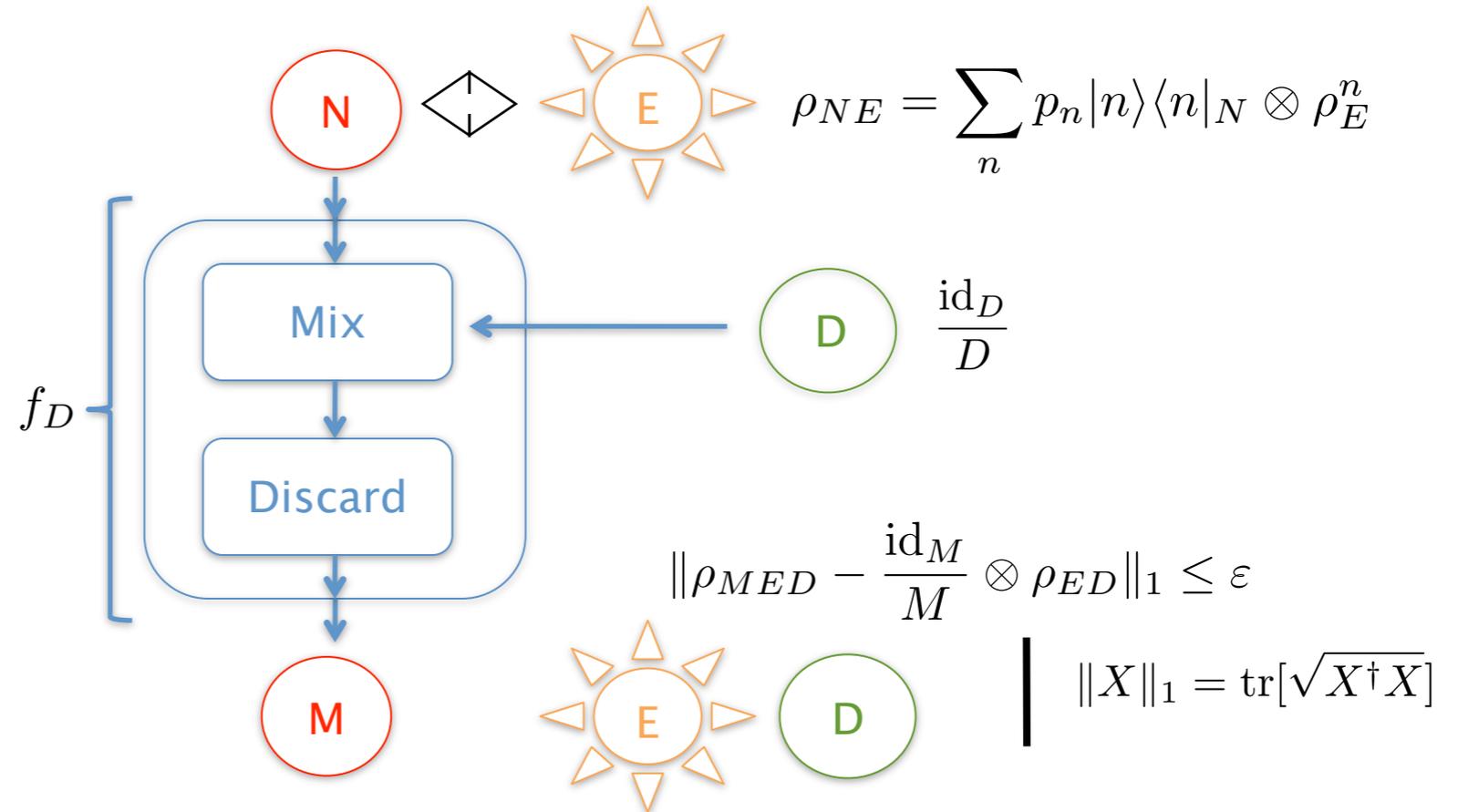
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- Ex: Two-universal hashing / privacy amplification [5]. For all cq-states  $\rho_{NE}$  with

$$H_{\min}(N|E)_\rho \geq k, \text{ we have } \|\rho_{MED} - \frac{\text{id}_M}{M} \otimes \rho_{ED}\|_1 \leq \epsilon \text{ for } M = 2^k \cdot \epsilon^2.$$

Strong  $(k, \epsilon)$  extractor (against quantum side information),  $D = O(N)$ .

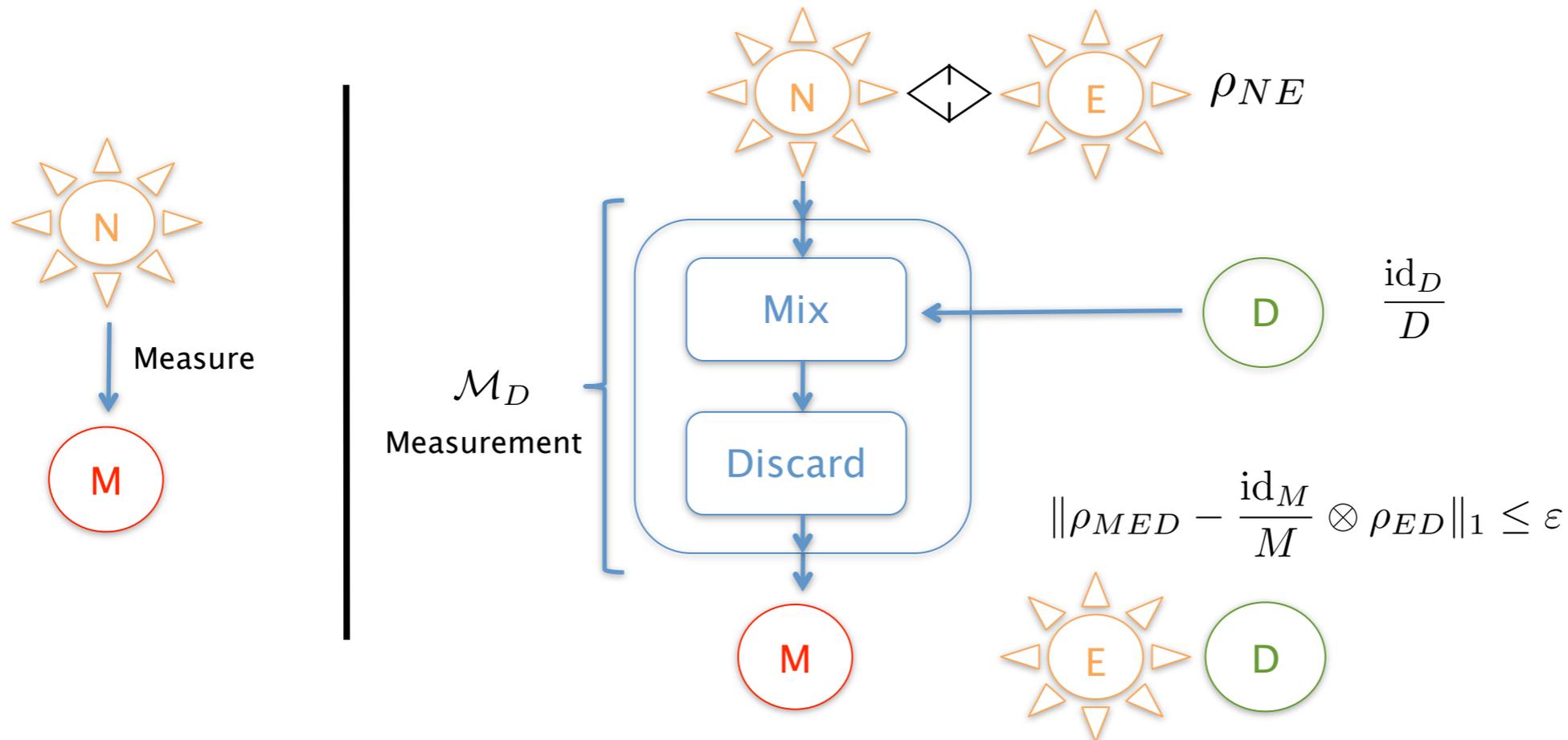
# Quantum to Classical (QC)-Randomness Extractors - Definition (I)

- Motivation: How to get weak randomness at first? How much randomness can be gained from a quantum source? Are all measurements equally “good” at obtaining randomness from a quantum system?

# Quantum to Classical (QC)-Randomness

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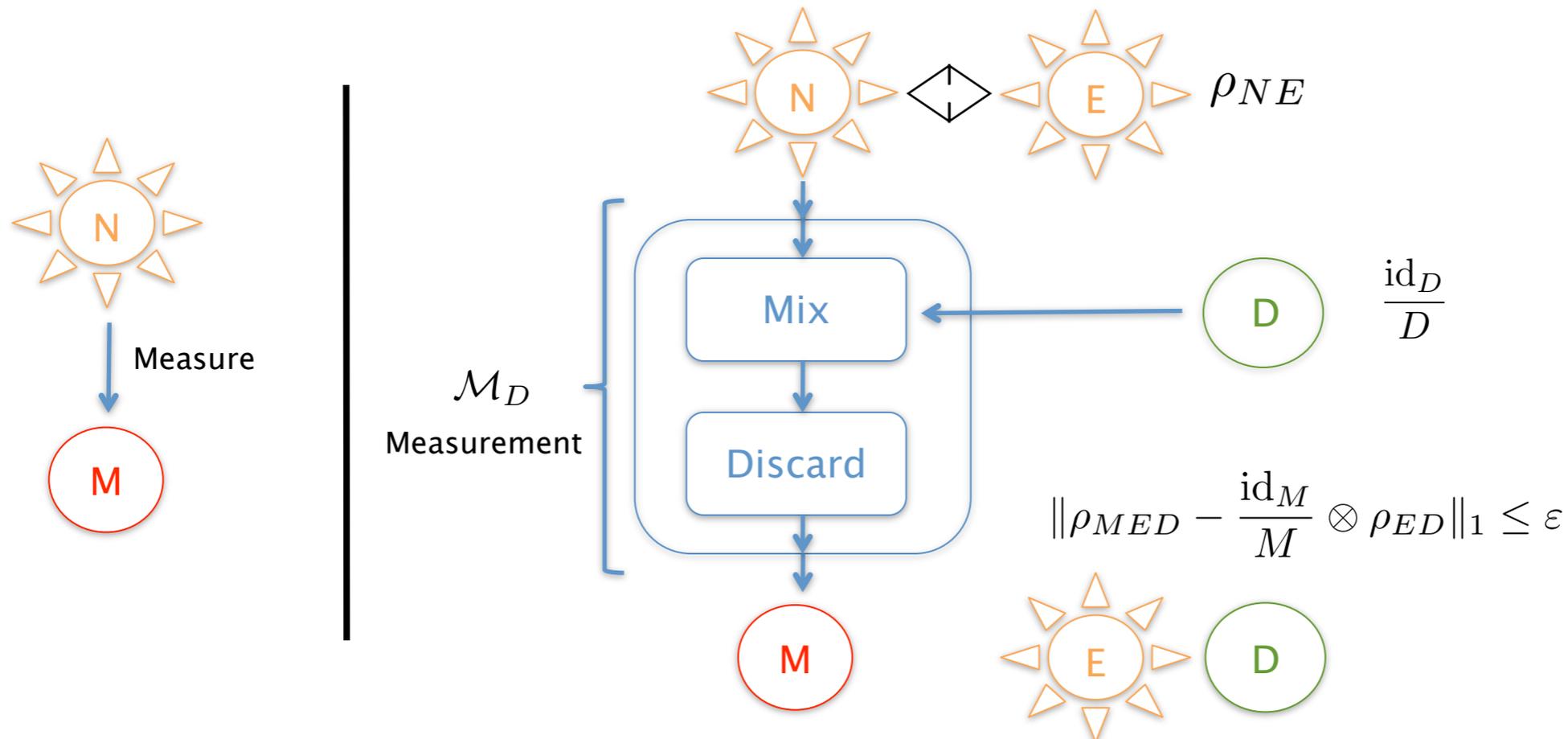
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- Idea: Same setup as in the classical case (no control of the source)! Only guarantee about the conditional min-entropy [6]:

$$H_{\min}(N|E)_{\rho} = -\log N \max_{\Lambda_{E \rightarrow N'}} F(\Phi_{NN'}, (\text{id}_N \otimes \Lambda_{E \rightarrow N'}) (\rho_{NE}))$$

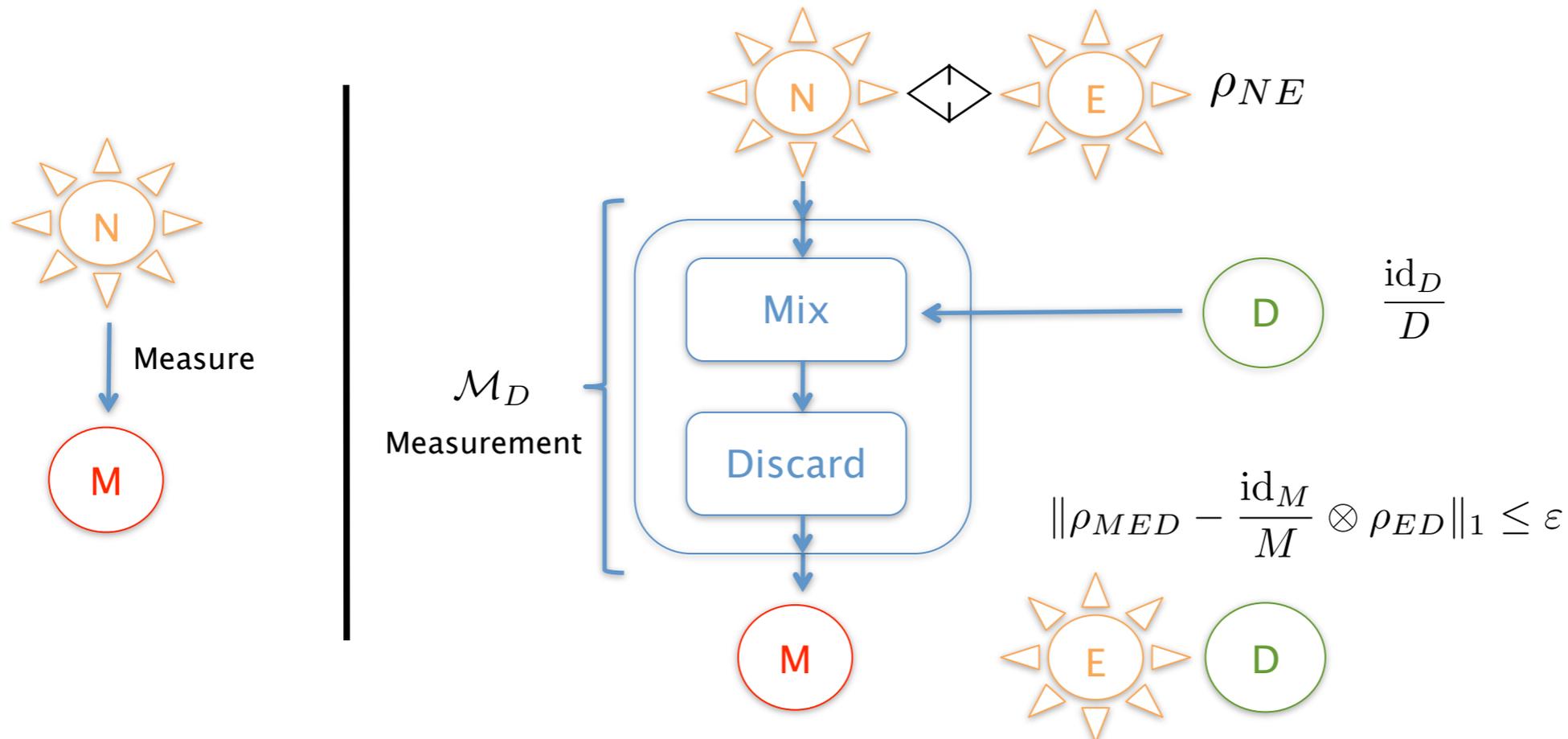
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$$F(\rho, \sigma) = \|\sqrt{\rho}\sqrt{\sigma}\|_1^2$$

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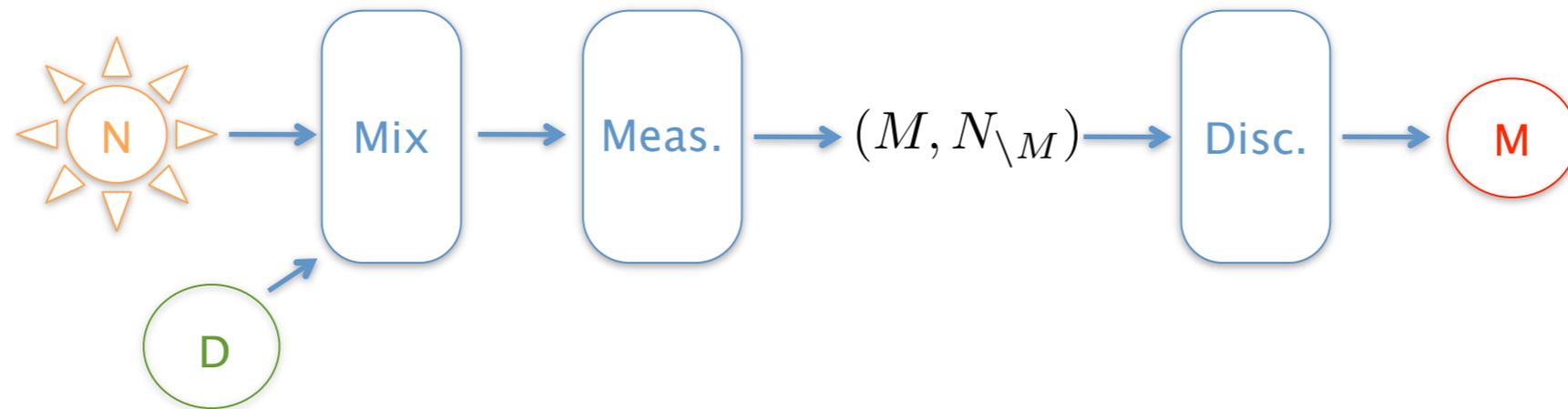
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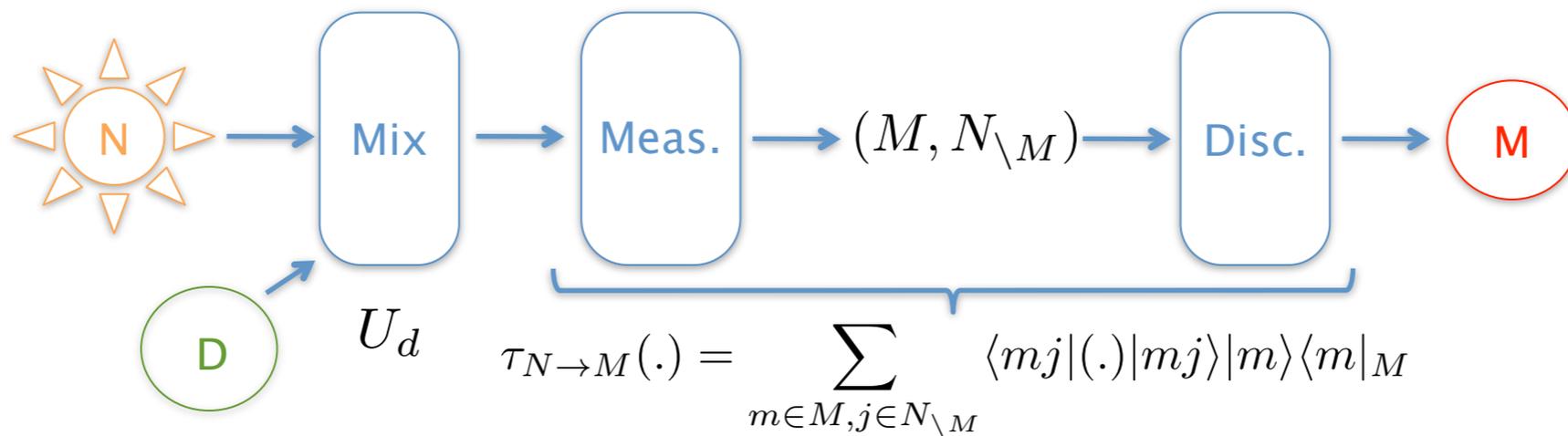
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- Can get negative for entangled input states, in fact for MES:  $H_{\min}(N|E)_{\Phi} = -\log N$ .

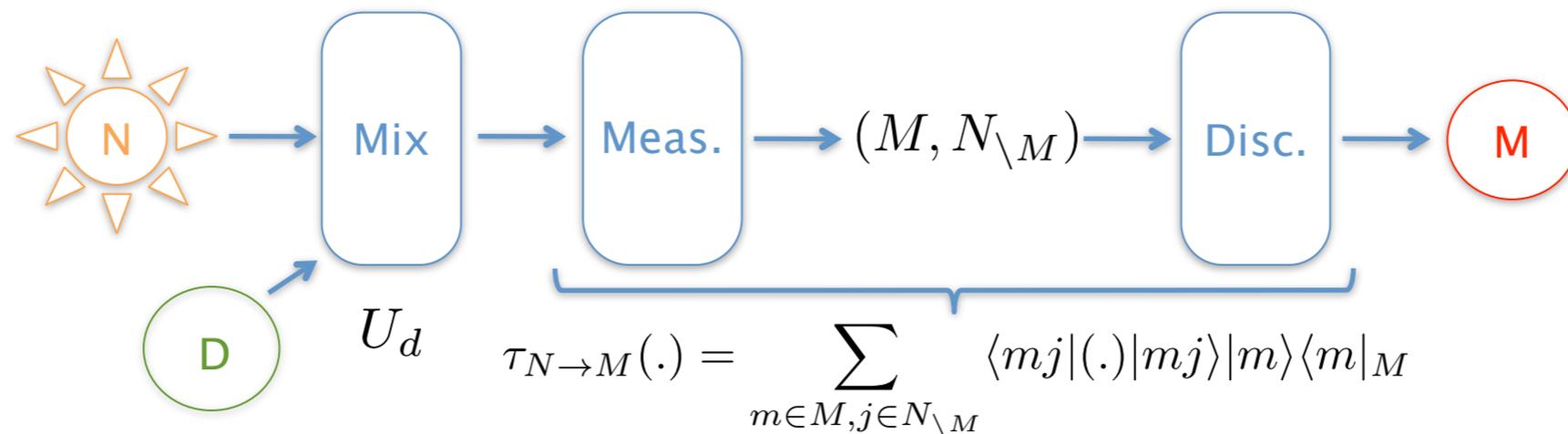
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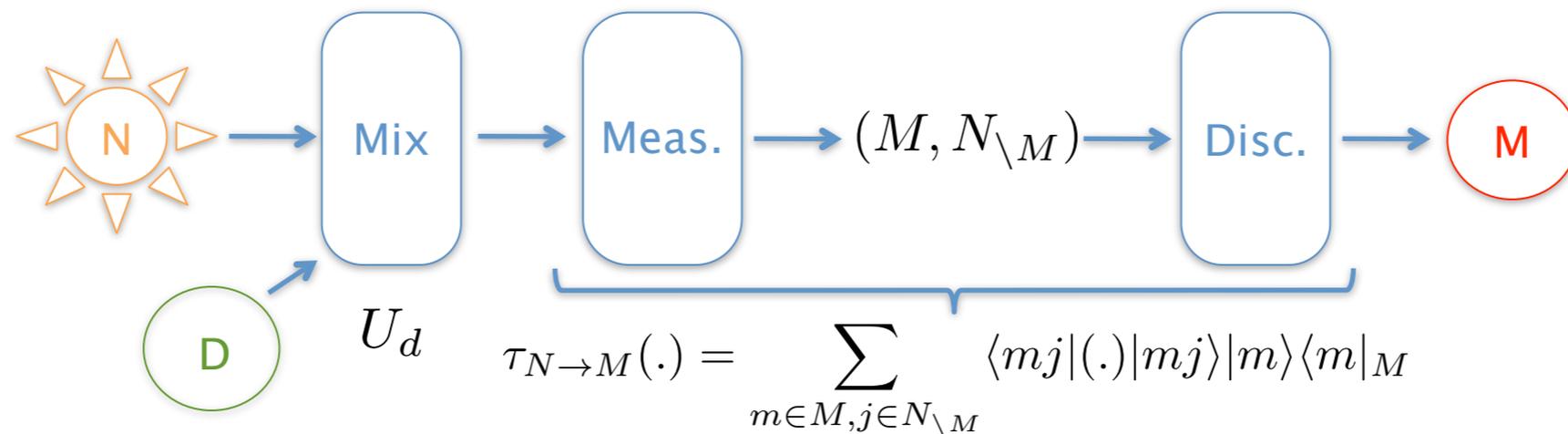
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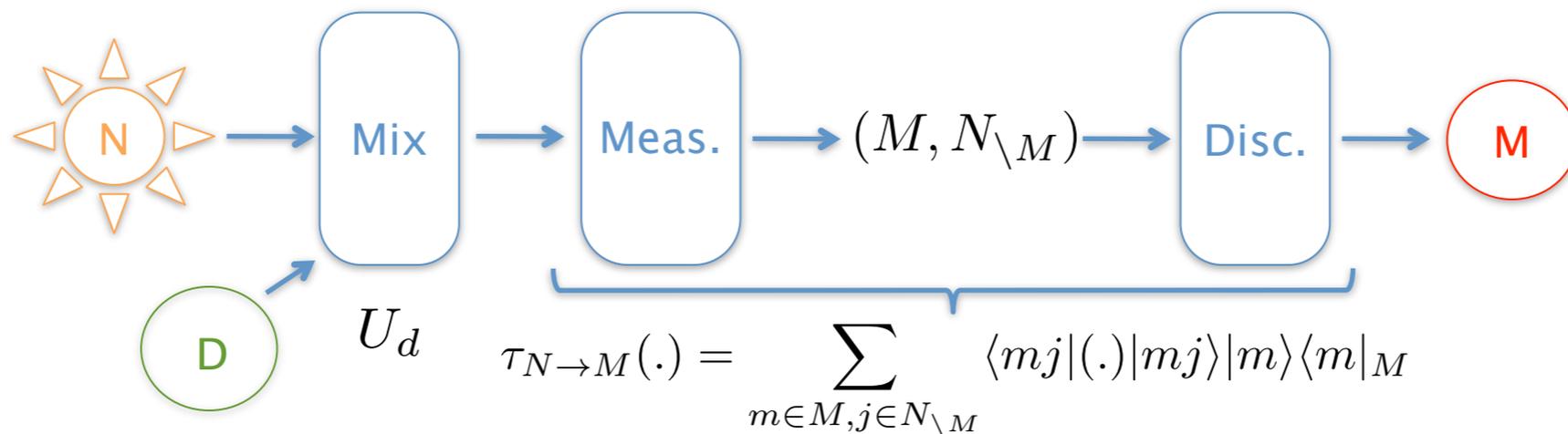


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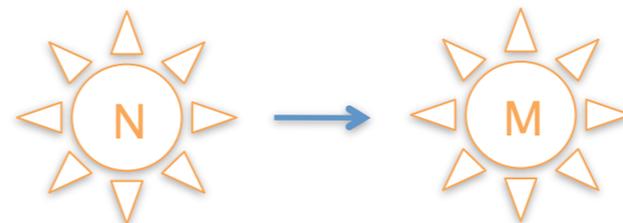
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- Fully quantum versions of this: decoupling theorems (quantum coding theory) [8], quantum state randomization [9], quantum extractors [10]: quantum to quantum (qq)-randomness extractors!



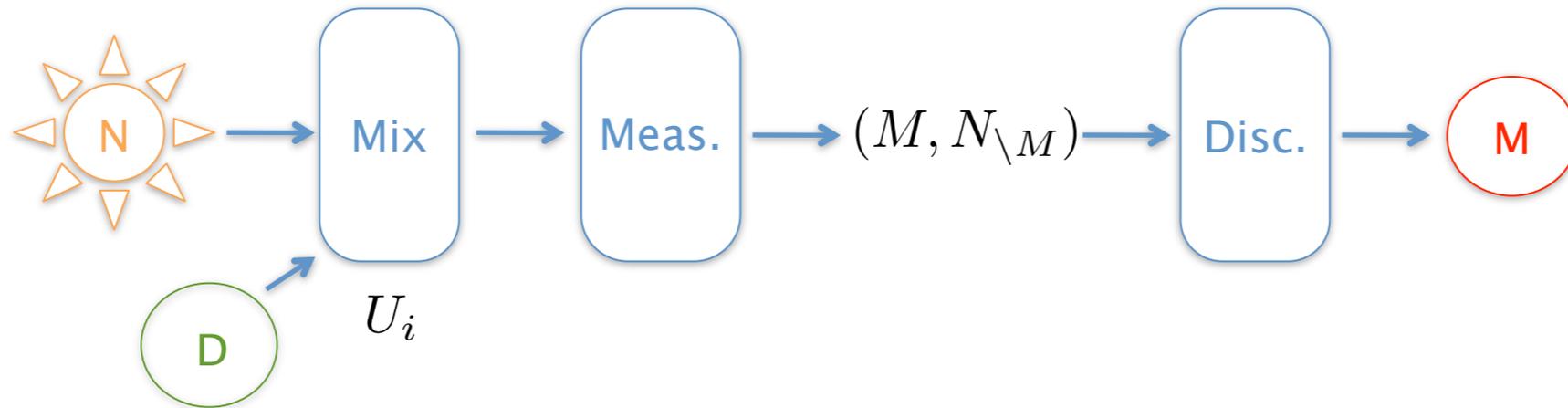
[7] Fawzi et al., STOC, 2011

[8] Dupuis, PhD Thesis, McGill, 2009

[9] Hayden et al., CMP 250:371, 2004

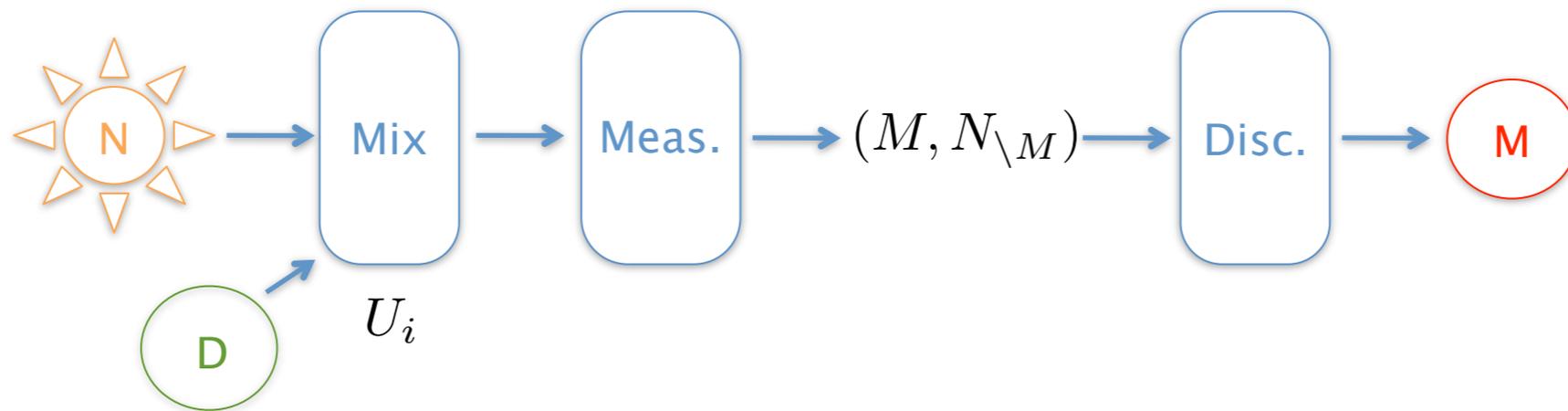
[10] Ben-Aroya et al., TOC 6:47, 2010

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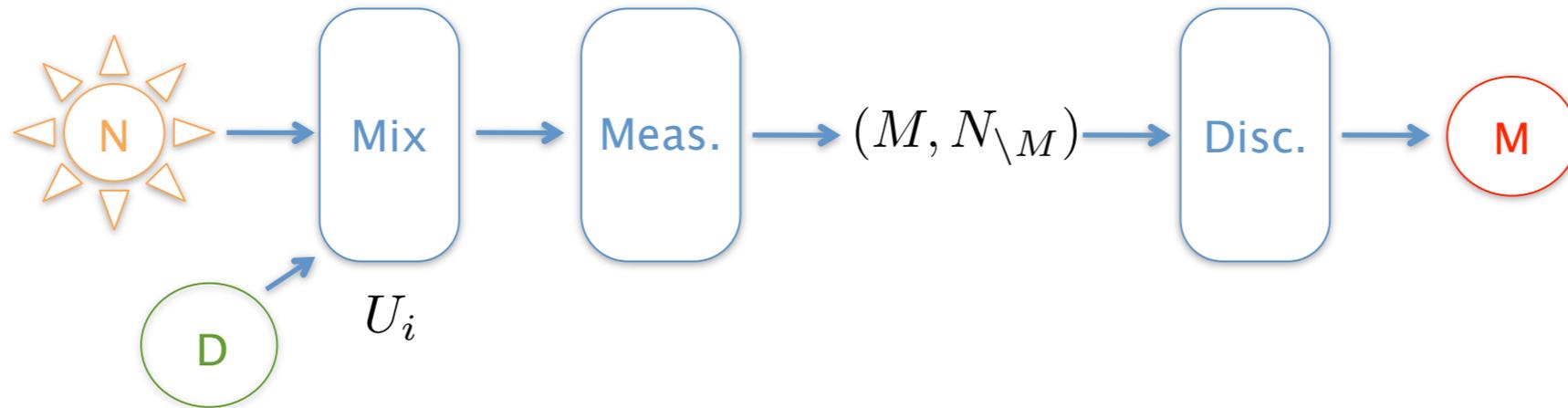
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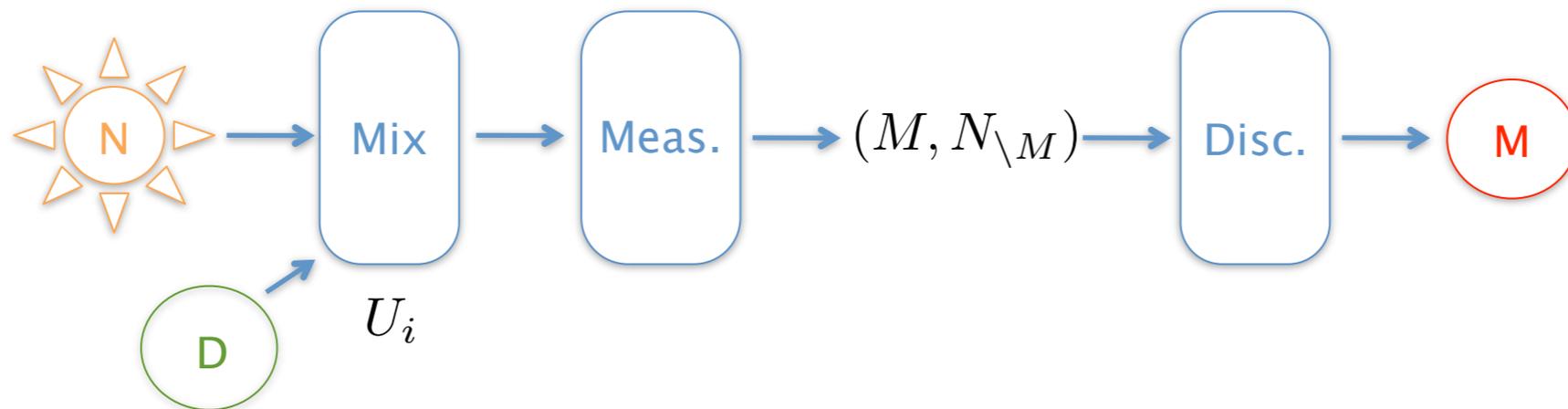
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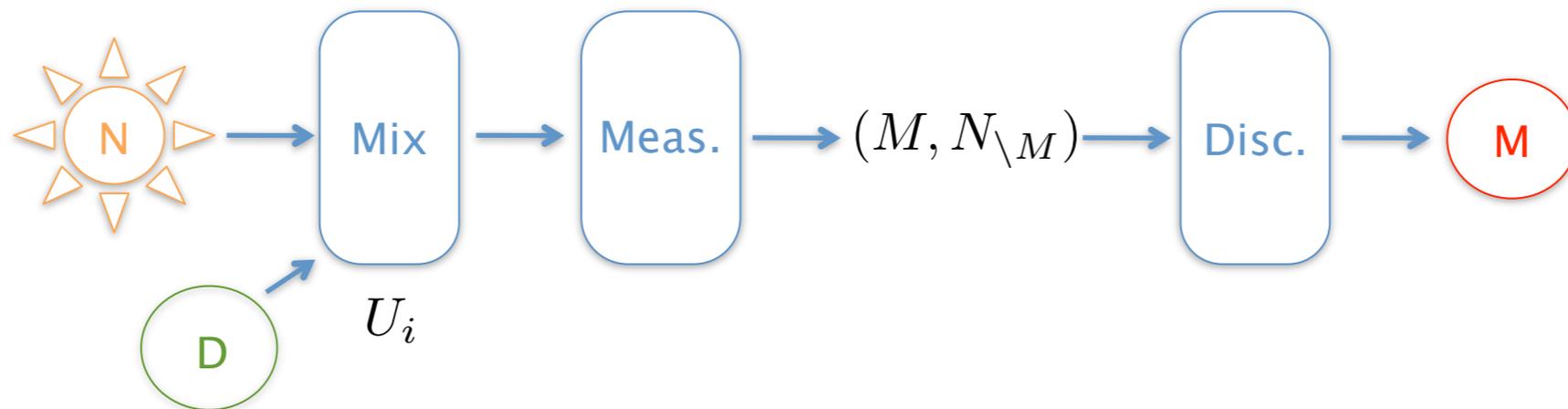
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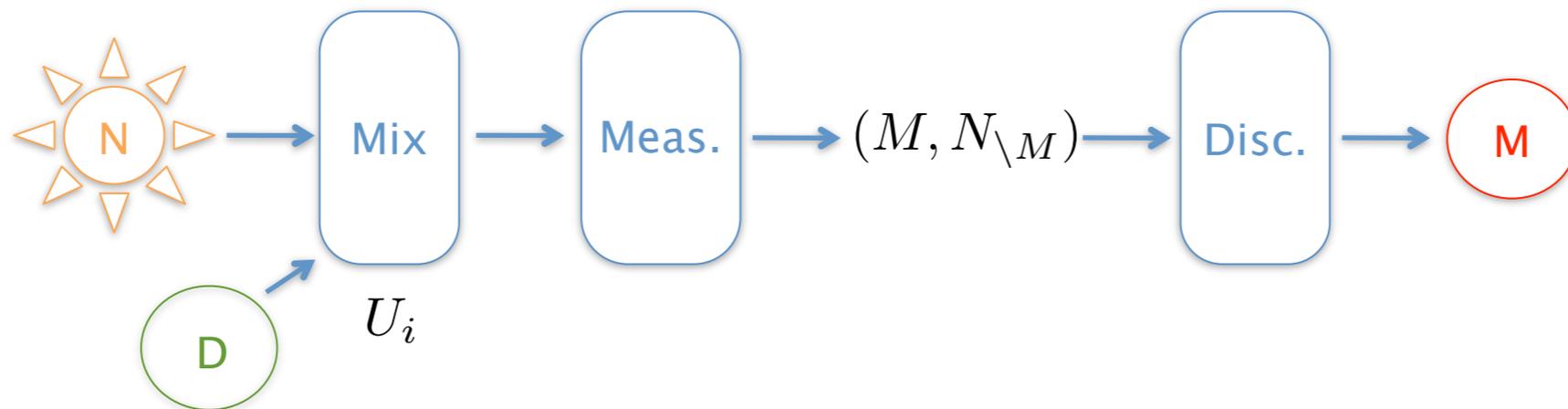
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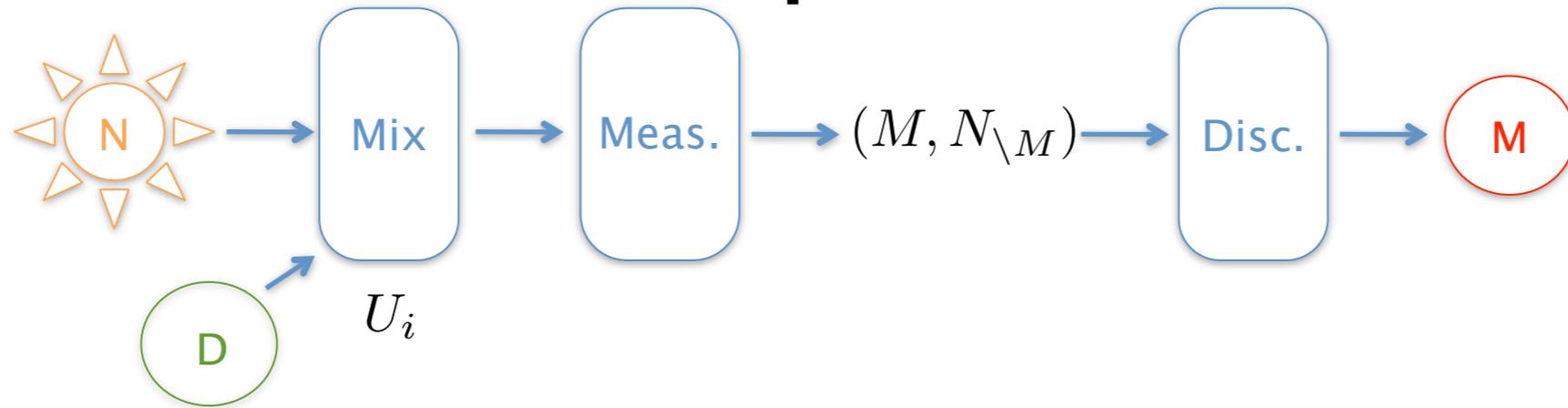
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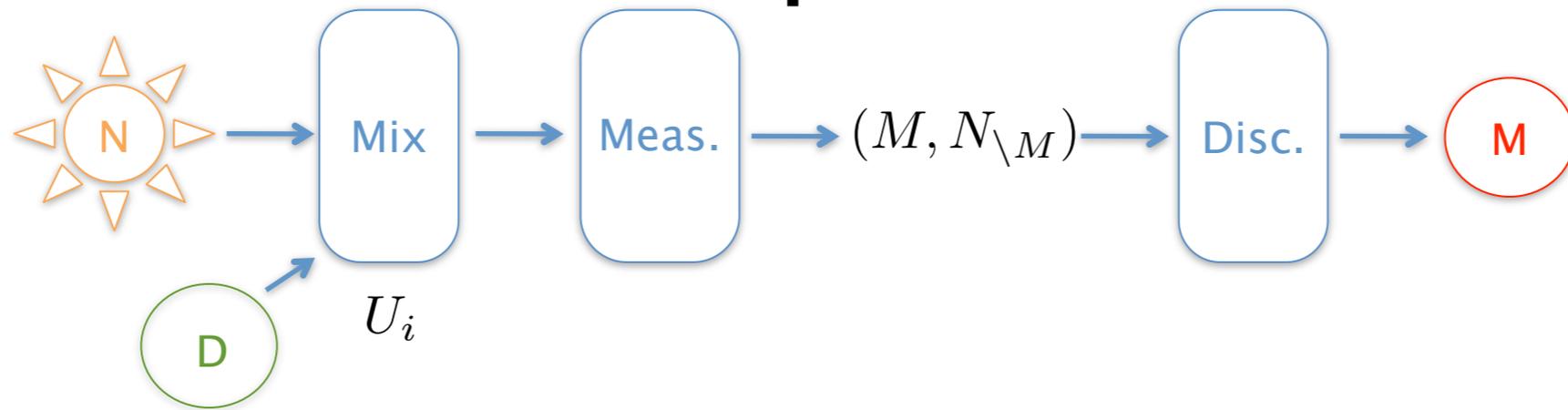
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- Find explicit constructions!

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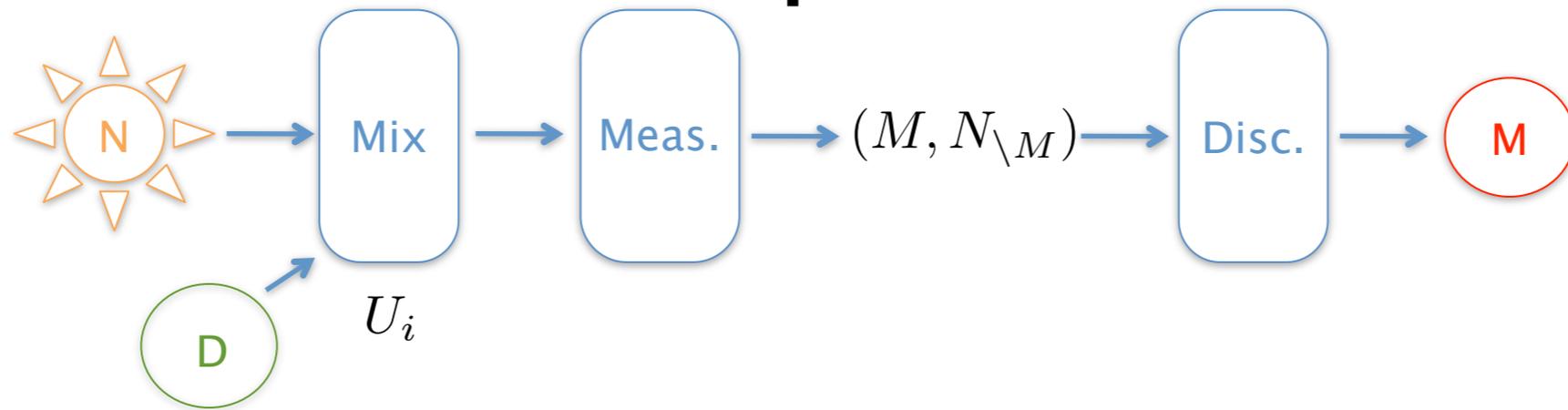


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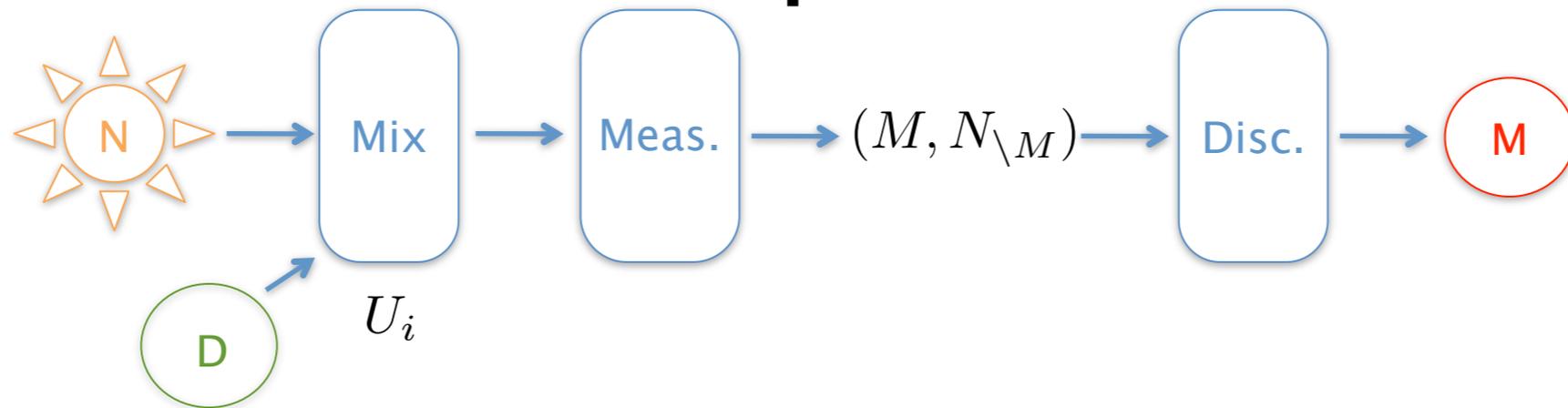
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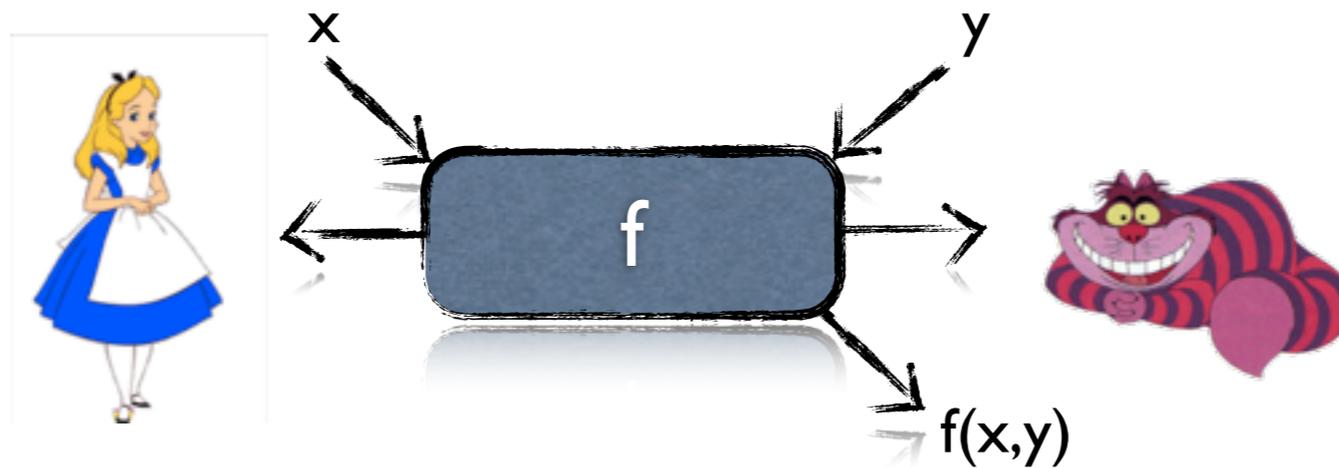
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- Bitwise qc-extractors! Let  $N = 2^n$ ,  $M = 2^m$ . Set of unitaries defined by a full set of mutually unbiased bases for each qubit,  $\{\sigma_X, \sigma_Y, \sigma_Z\}^{\otimes n}$ , together with two-wise independent permutations:

$$M = O(N^{\log 3 - 1} \cdot \epsilon^4) \cdot \min\{1, 2^k\} \quad D = N \cdot (N - 1) \cdot 3^{\log N}$$

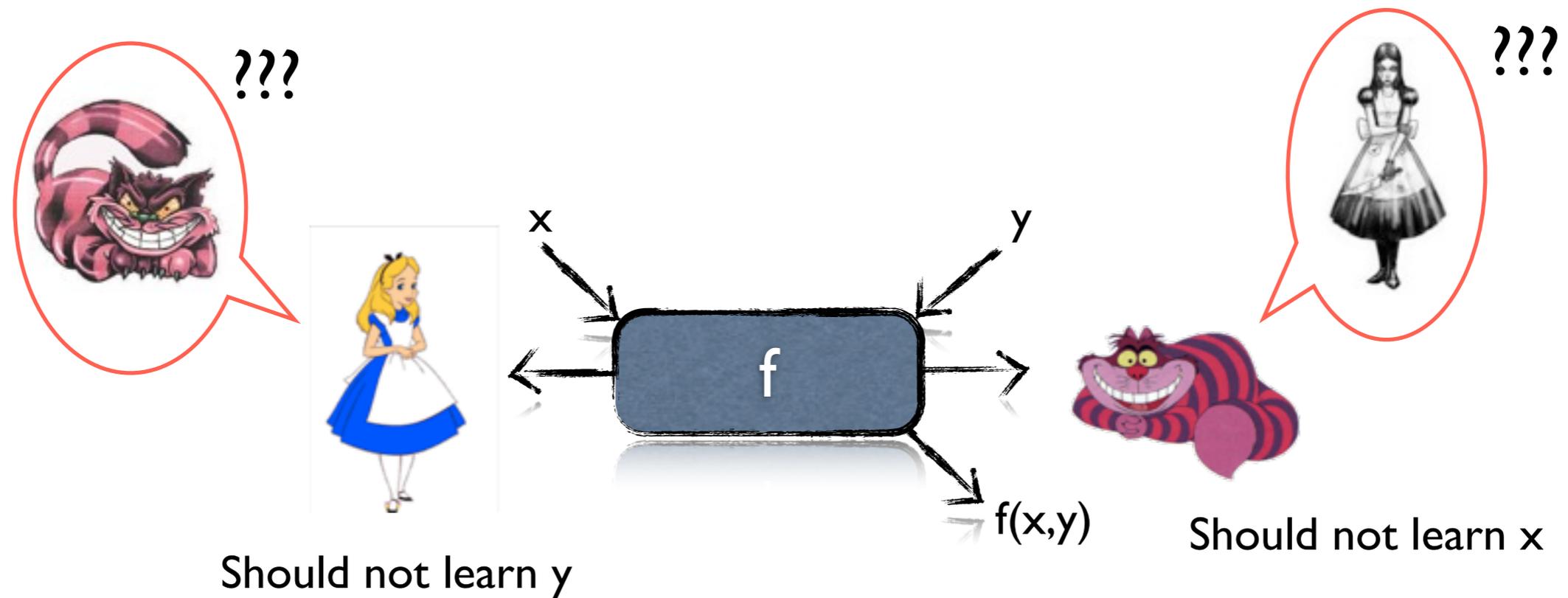
# Application: Two-Party Cryptography

- Example: secure function evaluation.



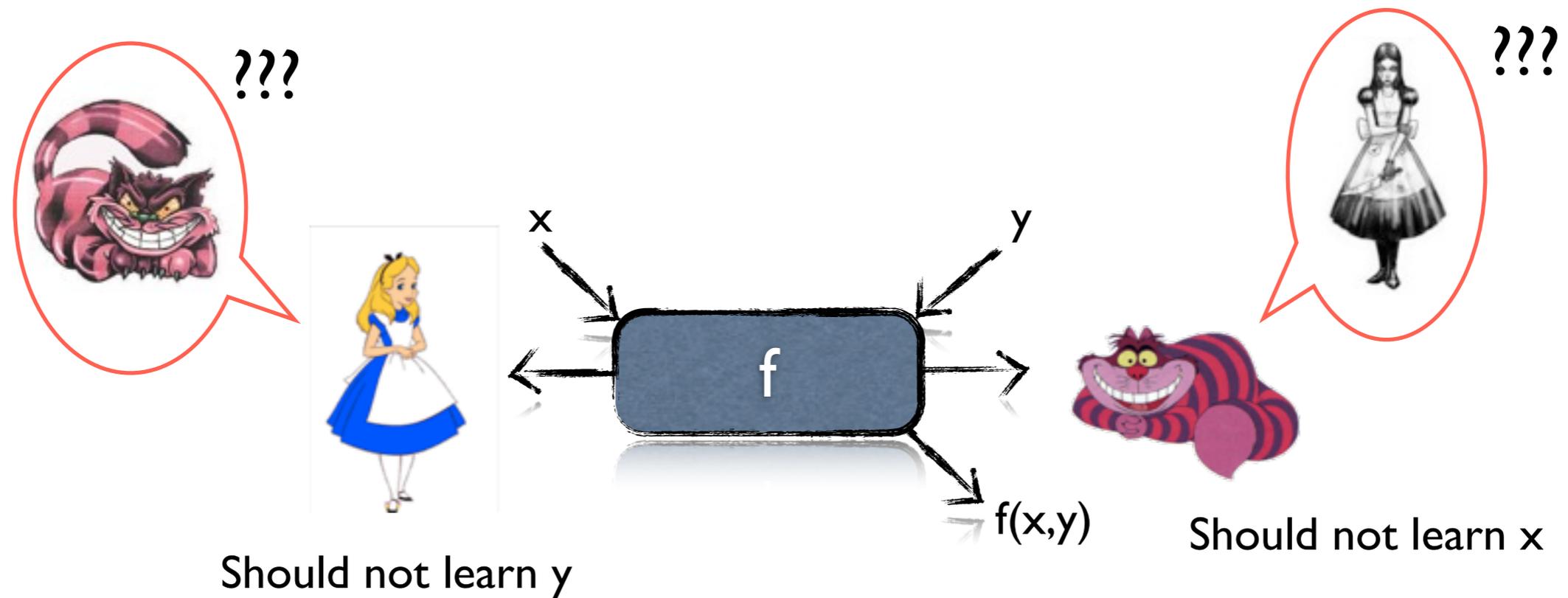
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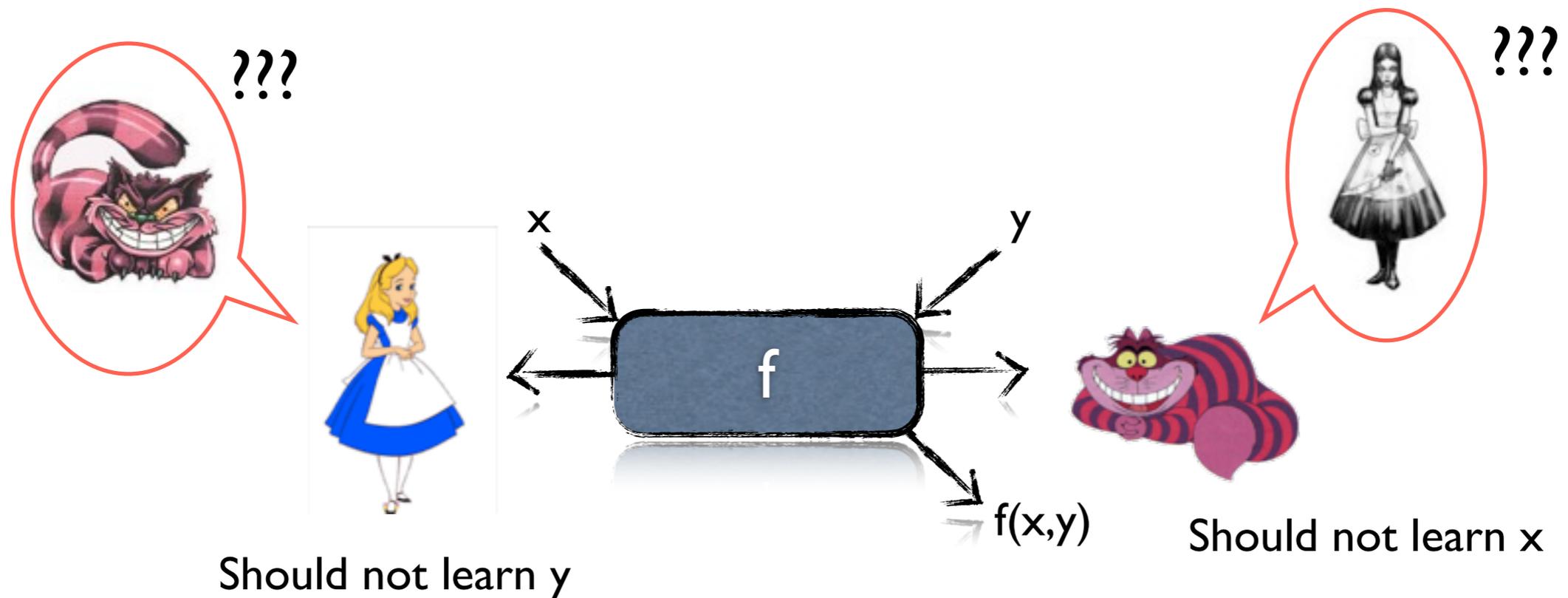
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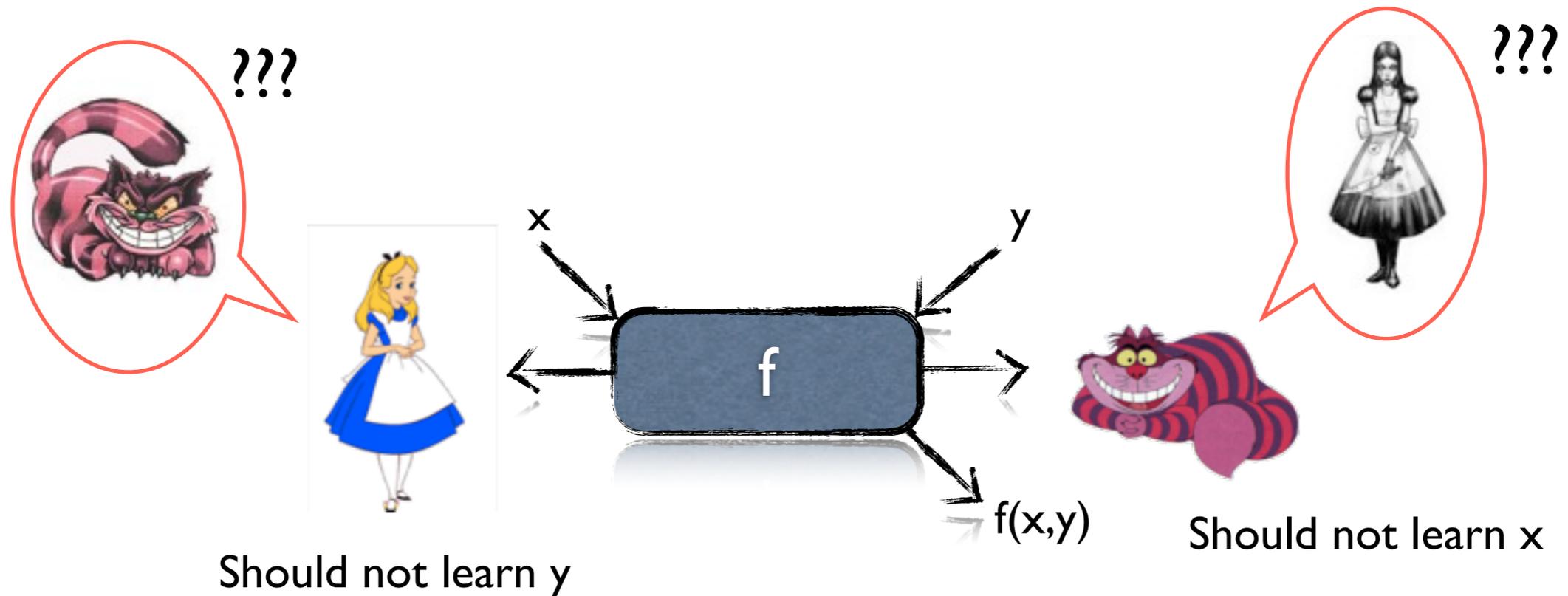
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# Application: Two-Party Cryptography

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- Physical assumption: bounded quantum storage [18], secure function evaluation becomes possible [19].

[17] Lo, PRA 56:1154, 1997

[18] Damgård et al., CRYPTO, 2007

[19] König et al., IEEE TIT 58:1962, 2012

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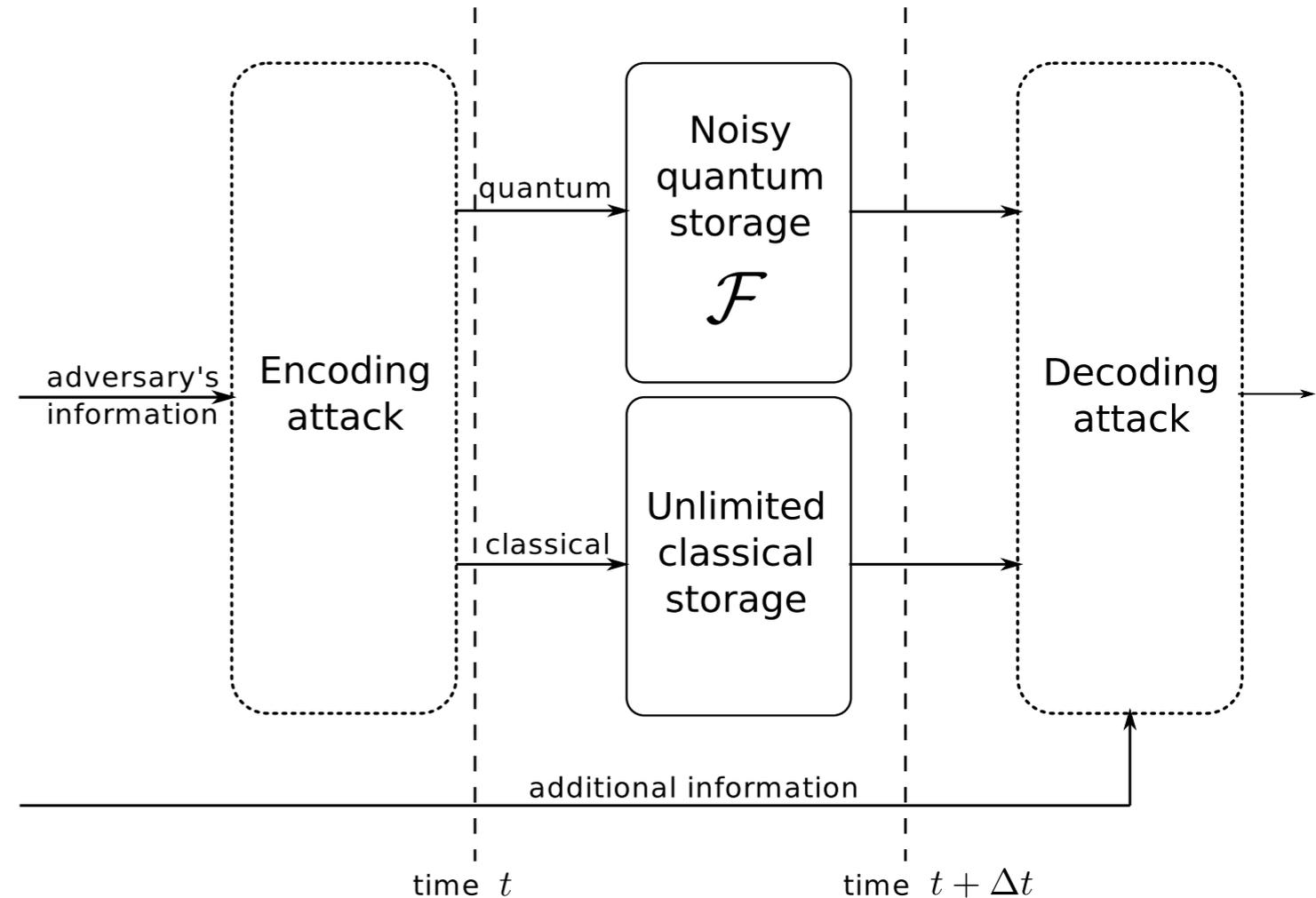


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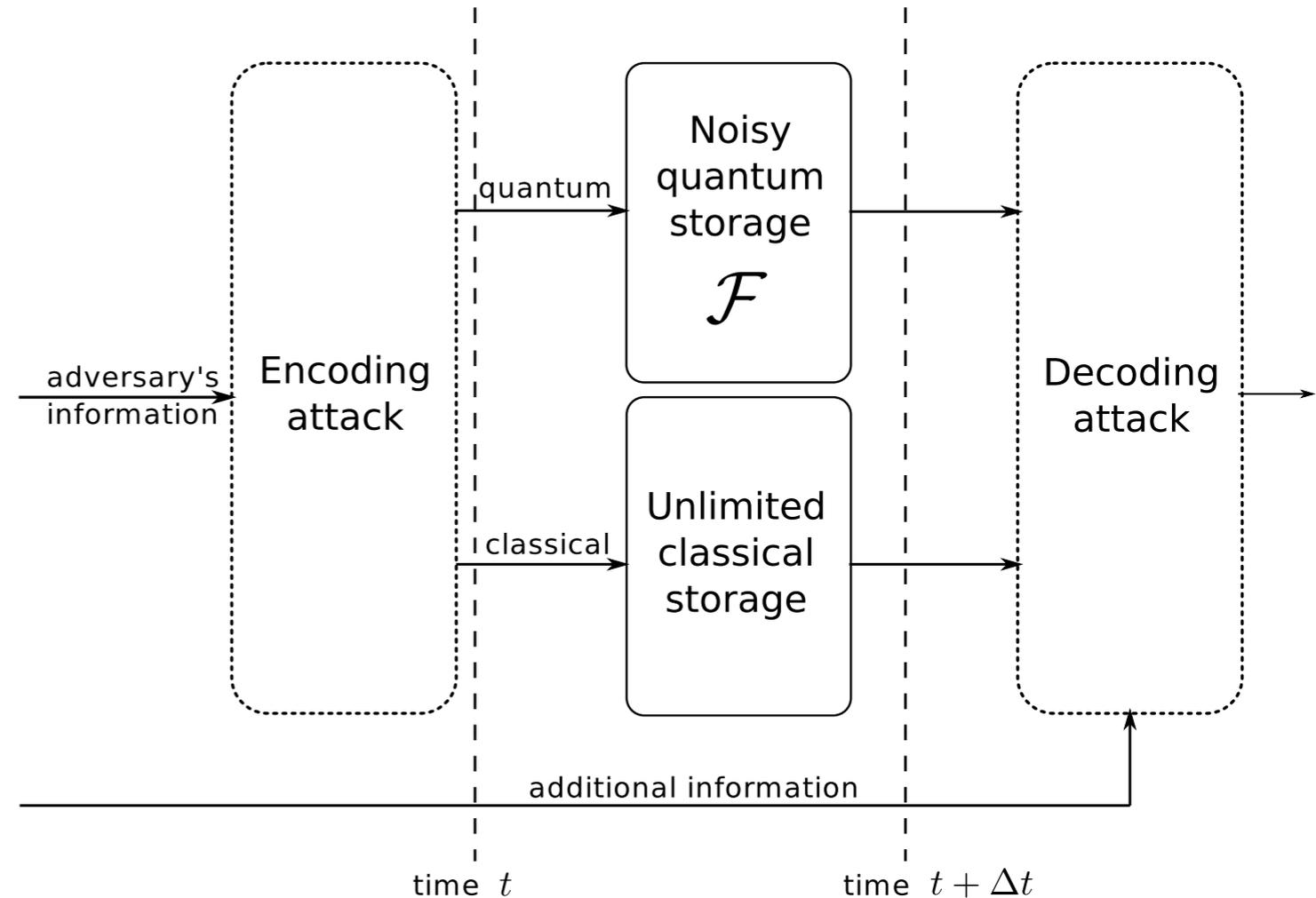
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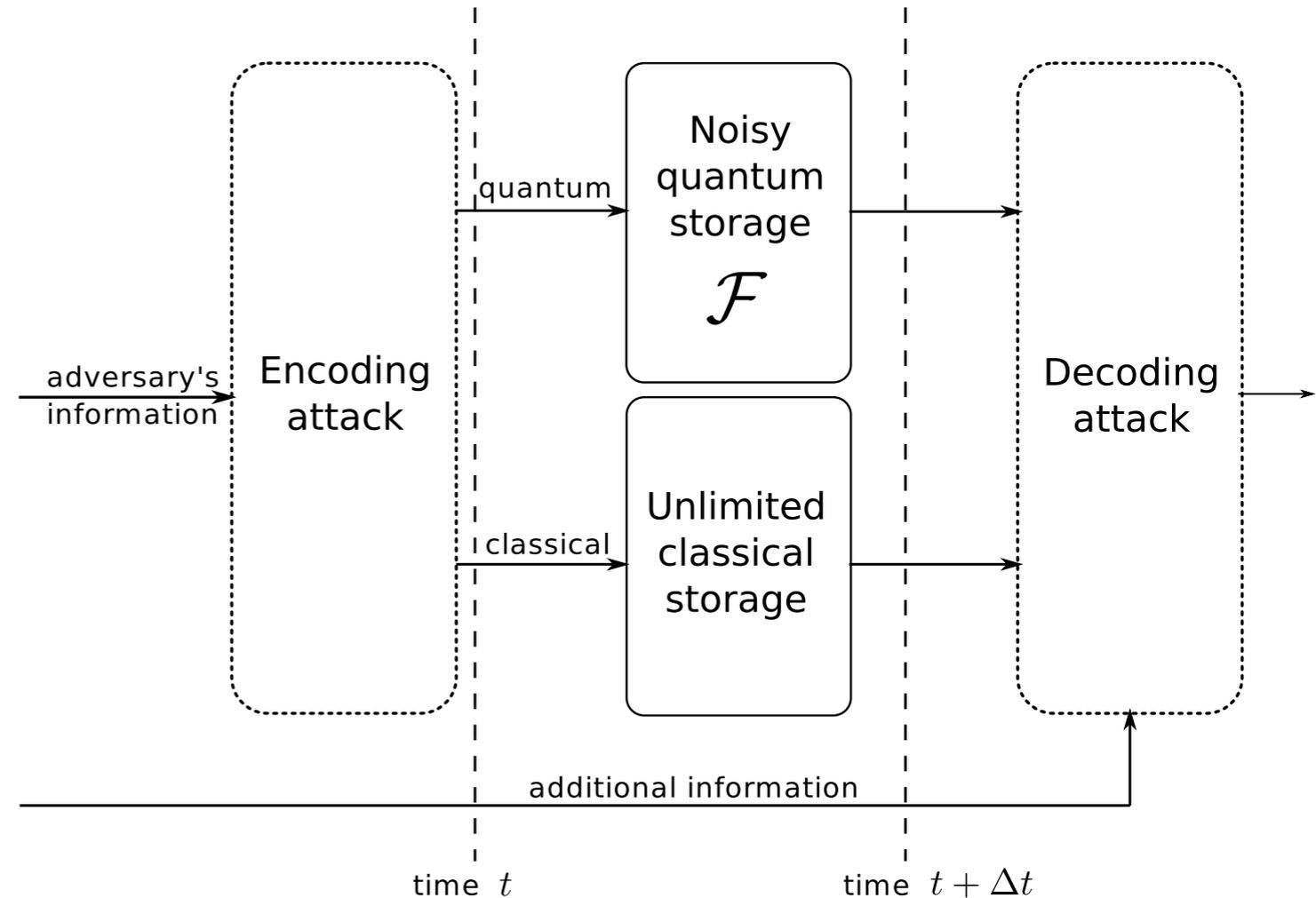
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- What the adversary can do: computationally all powerful, unlimited classical storage, actions are instantaneous, **BUT** noisy (bounded) quantum storage.
- Basic idea: protocol will have waiting times, in which noisy storage must be used!
- Implement task ‘weak string erasure’ (sufficient [21]). Using bitwise qc-randomness extractors, we can link security to the entanglement fidelity (quantum capacity) of the noisy quantum storage (improves [19,22])!



# Entropic Uncertainty Relations with Quantum Side Information

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here  $H(A)_\rho = -\text{tr}[\rho_A \log \rho_A]$ , the von Neumann entropy, and its conditional version  $H(A|B)_\rho = H(AB)_\rho - H(B)_\rho$  (which can get negative for entangled input states!).

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- QC-extractors (against quantum side information) give entropic uncertainty relations with quantum side information!
- Entropic uncertainty relations with quantum side information together with cc-extractors give qc-extractors (against quantum side information) [16]!

# Conclusions / Open Problems

- Definition of quantum to classical (qc)-randomness extractors.
  - Probabilistic and explicit constructions as well as converse bounds.
  - Security in the noisy-storage model linked to the quantum capacity.
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  - Bitwise qc-randomness extractor for  $\{\sigma_X, \sigma_Z\}^{\otimes n}$  (BB84) encoding? Improve bound for  $\{\sigma_X, \sigma_Y, \sigma_Z\}^{\otimes n}$  (six-state) encoding for large  $n$ ?

[23] Ve et al., arXiv:0912.5514v3

[12] Fawzi, PhD Thesis, McGill, 2012