

# New Time-Memory Trade-Offs for Subset Sum – Improving ISD in Theory and Practice

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- Unifying the Landscape of Time-Memory Trade-Offs for Subset Sum
- Translates to Information-Set-Decoding for Code-based crypto
- Implementation and new record computations
- From this new estimates for code based cryptography

## Random Subset Sum Problem

**Given:**  $(\mathbf{a}, t = \sum_{i=1}^n \mathbf{a}_i \cdot \mathbf{e}_i)$ , with  $\mathbf{a} := (a_1, \dots, a_n) \in \mathbb{Z}_{2^n}^n$ ,  $\mathbf{e} \in \{0, 1\}^n$ ,

$\text{wt}(\mathbf{e}) = \frac{n}{2}$

**Find:**  $\mathbf{e} \in \{0, 1\}^n$

- Cryptographic Application: Hard problem for post-quantum cryptography
- Algorithmic tool used in Cryptanalysis
- Best attacks on McEliece/BIKE/HQC use a lot of memory

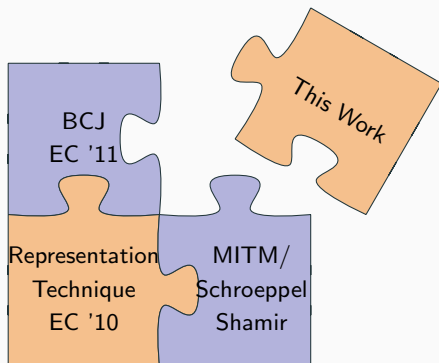
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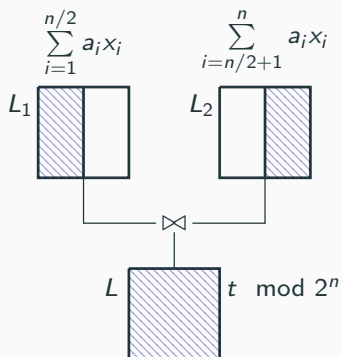
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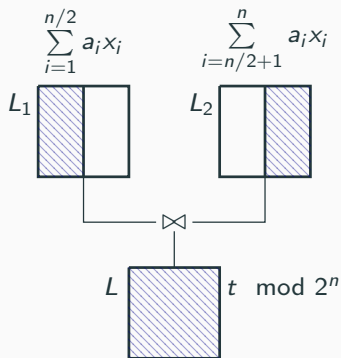
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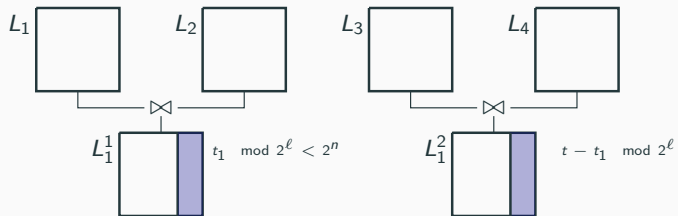
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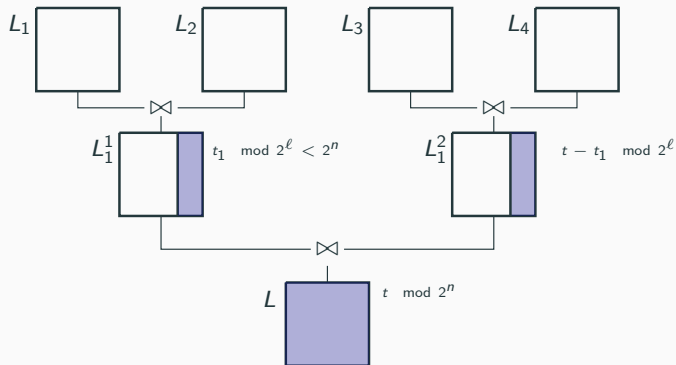


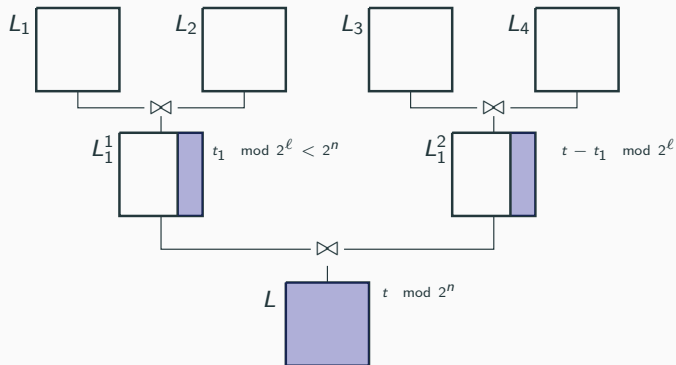
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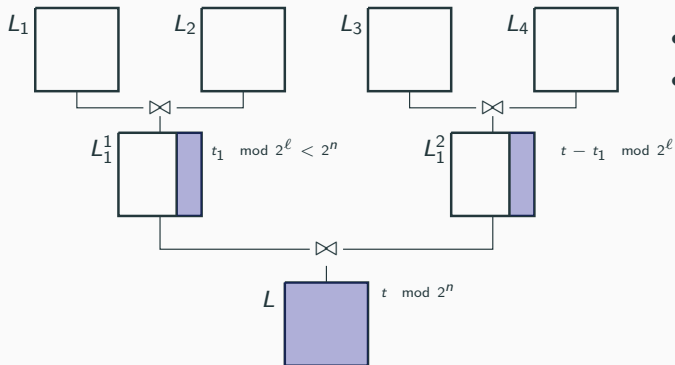












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Example: 10110010:

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$\mathbb{E}(\text{solutions})$	1	$\binom{n/2}{n/4} = 2^{n/2}$

## Problem:

How to examine a  $2^{-n/2}$  fraction of the search space?

Level

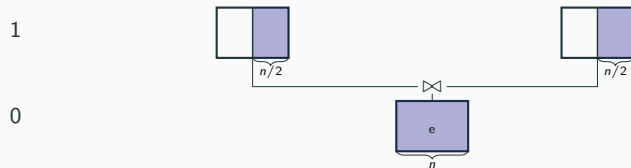
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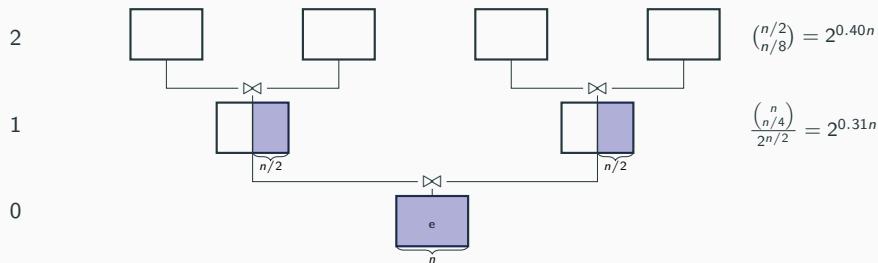
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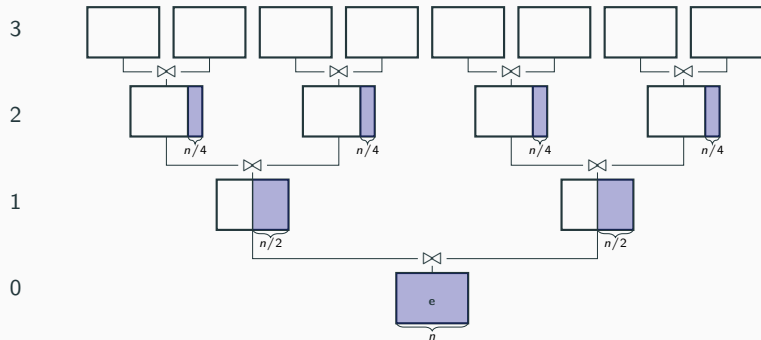
Level

List Sizes



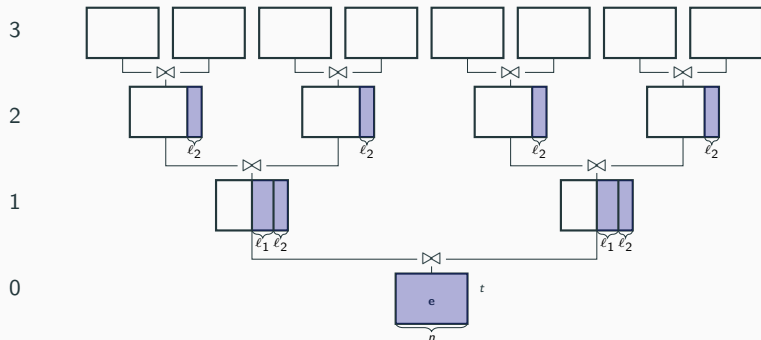
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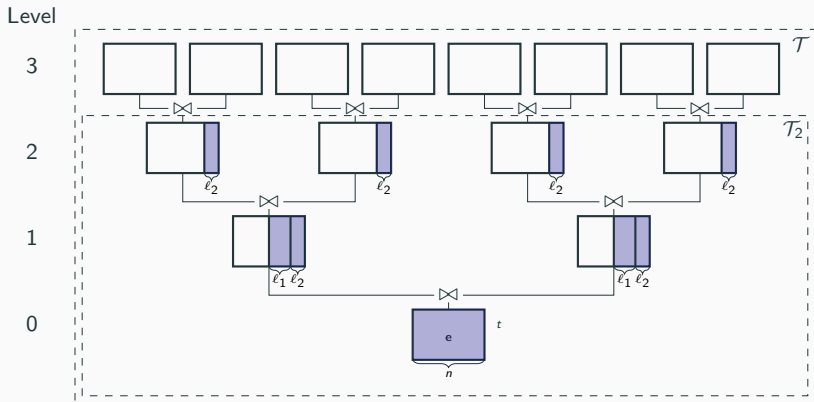


# Contribution: New Time-Memory Trade-Off

Level

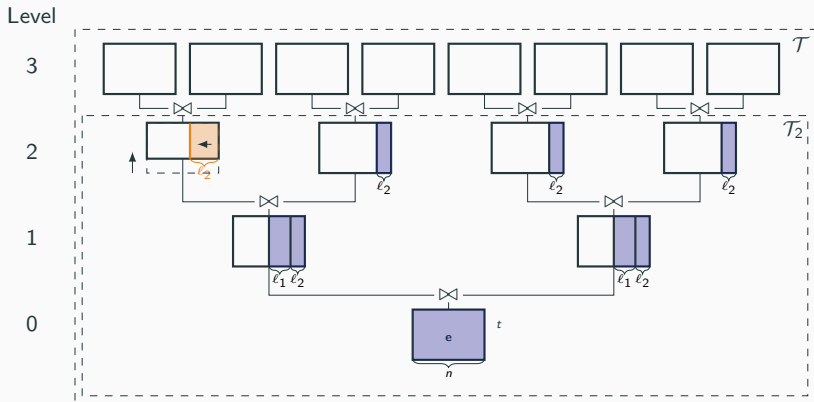


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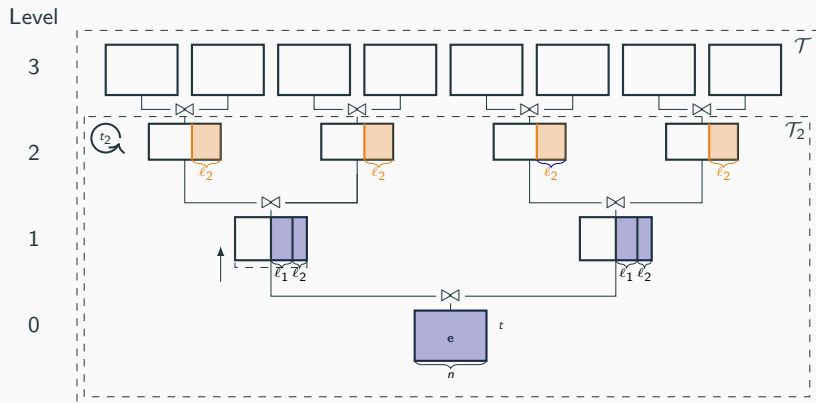




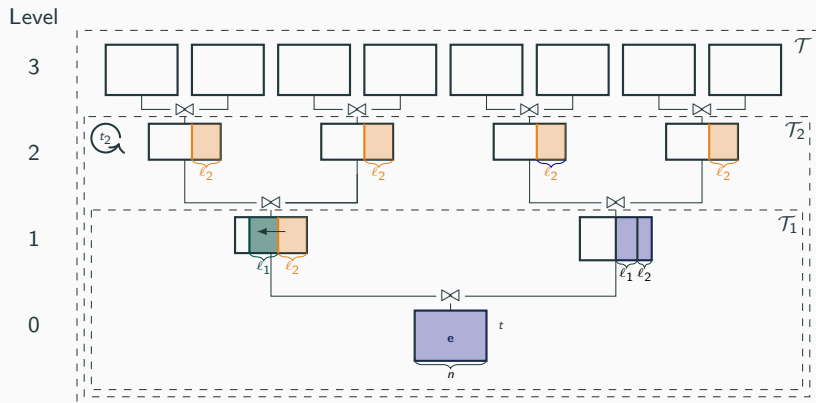
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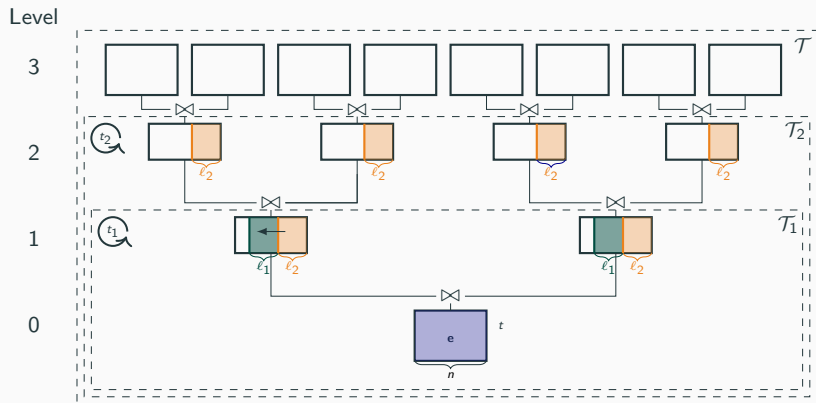
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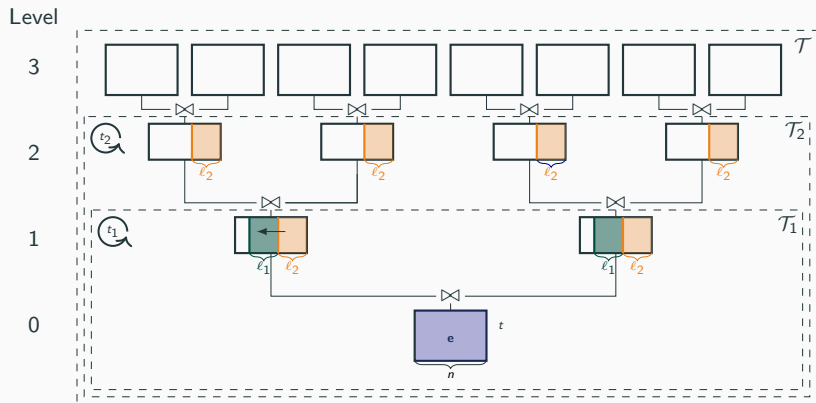
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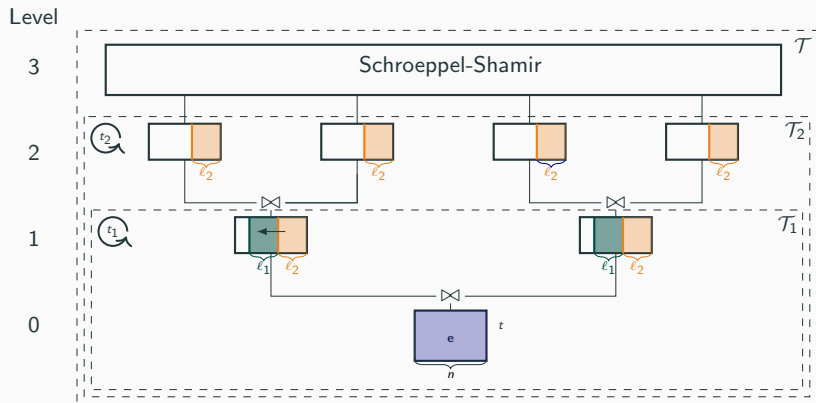
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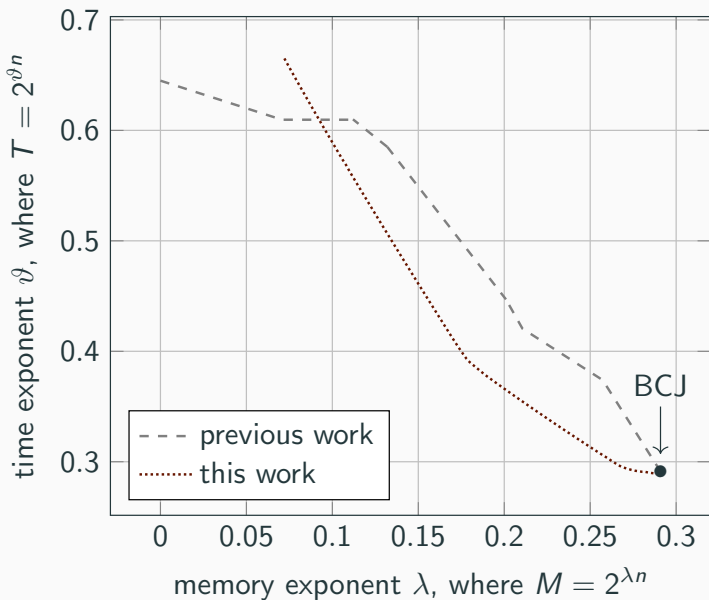
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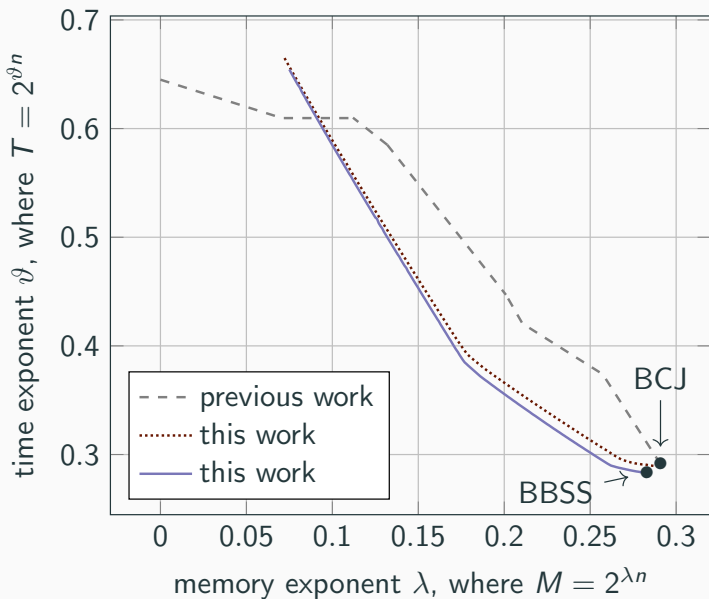
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## Results: Subset Sum

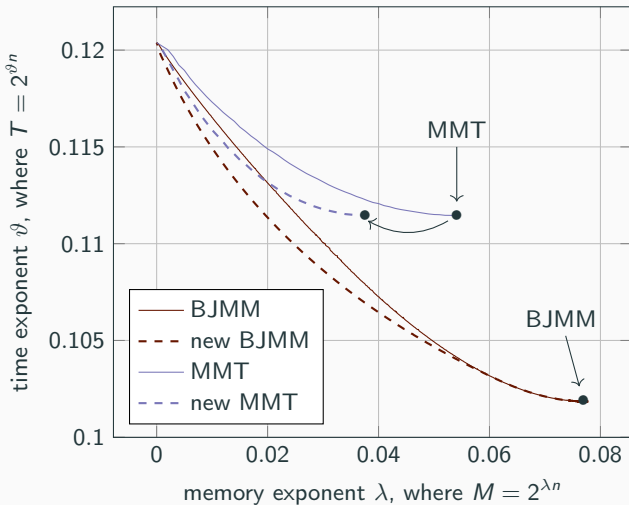


## Results: Subset Sum





## Results: Decoding



# Estimating Security

		Cat. I AES-128	Cat. III AES-192	Cat. Va AES-256	Cat. Vb AES-256	Cat. Vc AES-256
<u>McEliece</u>	unlimited	1	1	1	1	1
	$M \leq 2^{80}$	1	2	2	2	1
	$M \leq 2^{60}$	2	1	5	5	6
<u>BIKE</u>	unlimited	3	3	3	-	-
<u>HQC</u>	unlimited	3	3	3	-	-

- Significant Speedups in the restricted memory regime  $M \geq 2^{0.091n}$
- Unified Time-Memory Trade-Offs landscape for Subset Sum
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**Thank You!**

<https://eprint.iacr.org/2022/1329>

<https://github.com/FloydZ/decoding>