

Linear Repairing Codes and Side-Channel Attacks

Hervé CHABANNE, Housseem MAGHREBI and Emmanuel PROUFF

IDEMIA, UL, ANSSI

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ANSSI





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 - ▶ Bit x masked $\mapsto x_0, x_1, \dots, x_d$
 - ▶ Leakage : $L_i \sim x_i + \mathcal{N}(\mu, \sigma^2)$
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- Theory available to prove the security in (relatively) sound models *DucDziembowskiFaust14*.



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- Theory available to prove the security in (relatively) sound models *DucDziembowskiFaust14*.
- Tools have been developed to automatize the proofs (e.g. *BartheBelaidDupressoirFouqueGrégoireStrub15*)



- **First Issue:** how to share sensitive data?



- **Second Issue:** how to securely process on shared data?



■ First Issue: how to share sensitive data?

■ Related to:

- ▶ secret sharing *Shamir79*
- ▶ design of error correcting codes with large dual distance
Massey93, CastagnosRennerZémor13
- ▶ etc.

■ Second Issue: how to securely process on shared data?

■ Related to:

- ▶ secure multi-party computation
NikovaRijmenSchläffer2008 ProuffRoche2011
- ▶ circuit processing in presence of leakage *e.g.*
GoldwasserRothblum2012
- ▶ efficient polynomial evaluation *e.g.*
CarletGoubinProuffQuisquater-Rivain2012, CoronProuffRoche2012, CoronRoyVivek2014
- ▶ etc.



- (n, d) -SSS: polynomial formulation;
 - ▶ generate a random degree- d polynomial

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- **Reconstruction** with Lagrange's Formula and a subset U of $d + 1$:

$$Z = \sum_{Z_i \in U} Z_i \times \beta_i ,$$

where the constants β_i are defined as

$$\beta_i = \prod_{k=1, k \neq i}^n \frac{\alpha_k}{\alpha_i + \alpha_k} .$$



Choice of the Public Points α_i

Does the choice of the public points impact the security of SSS in the context of Side-Channel Analysis?

Optimal Number of Shares to Observe

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No influence on the effectiveness of Lagrange's reconstruction **BUT** the mutual information $(d + 1)$ -tuple of shares Z_i and Z seems to depend on the α_i *BalashFaustGierlichs15, WangStandaertYu+16.*

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Since the knowledge of $d + 1$ shares Z_i is sufficient to recover Z , it is commonly assumed that the optimal number is $d + 1$.



Test of template attacks against a $(5, 2)$ -SSS (Z_0, Z_1, \dots, Z_4) of Z

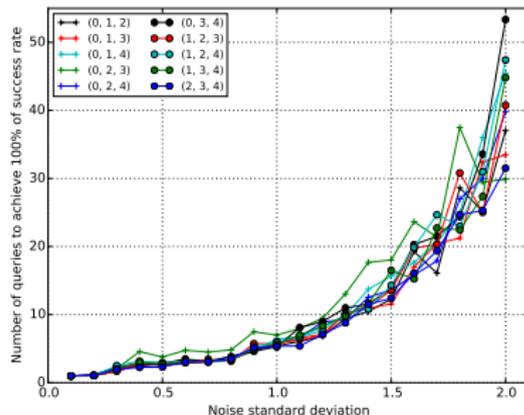
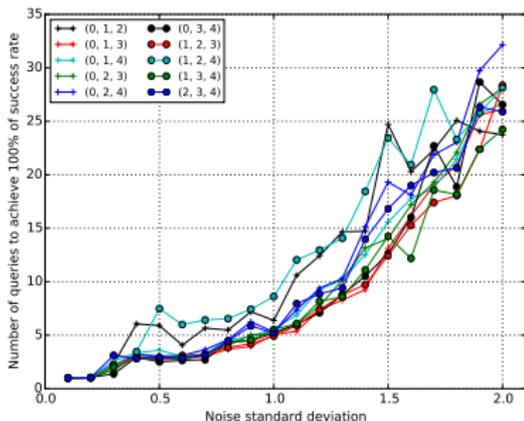


Figure: Number of observations to achieve a success rate of 100% wrt noise standard deviation for two different sets of public points.



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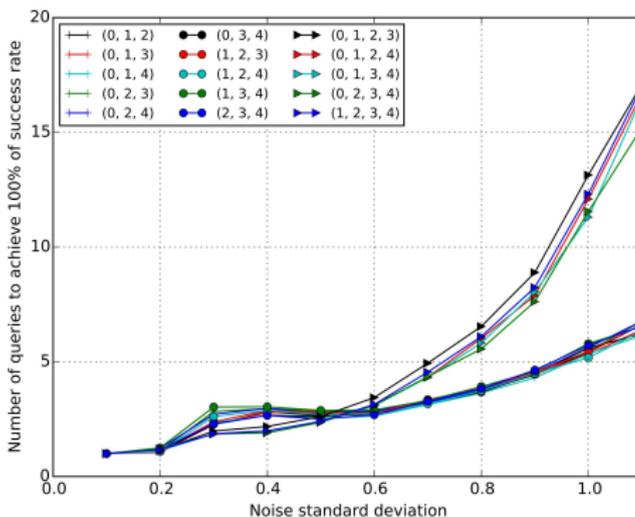


Figure: For different choices of tuples of shares, the number of observations required to achieve a 100% success rate vs the standard deviation of the noise.



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- Observation 2: for some SNR, it is better to target strictly more than the sufficient number of shares needed to recover Z !
- Rest of this talk: explain this phenomenon.



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- **Example** *GuruswamiWootters16*:
 - ▶ for some $(14, 9)$ -SSS sharing
 - ▶ Z can be recovered with only 64 bits of information on the Z_i
 - ▶ instead of $80 = 10 \times 8$ bits (if 10 shares are targeted)



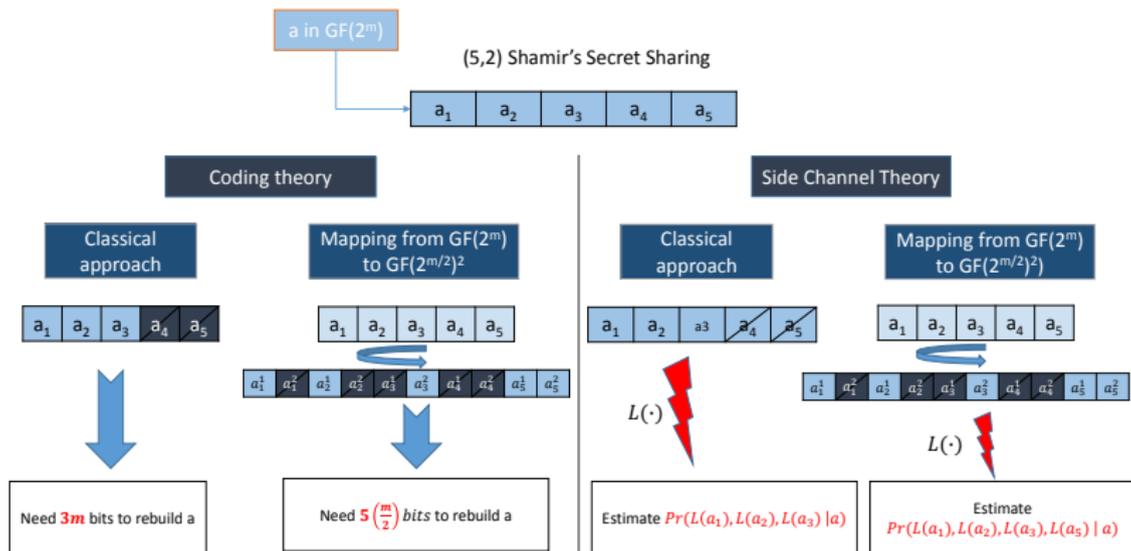


Figure: Side-channel and linear repairing codes for Shamir's sharing.



Z shared into (Z_1, \dots, Z_n) s.t. $Z_i = P_Z(\alpha_i)$ and $Z = P_Z(0)$.

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- **Main Idea in GuruswamiWootters16:** change the projections and, for each coordinate, **interpolate** $p_j(X) \times P_Z(X)$ **instead of** $P_Z(X)$ for well chosen polynomials $p_j(X)$.



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- **Necessary Condition**: $p_1(0), p_2(0), \dots, p_t(0)$ spans vector space of dimension t .



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- **Conclusion:** more shares are needed (**10 instead of 8**) but less information is needed (**64 bits instead of 80 bits**)



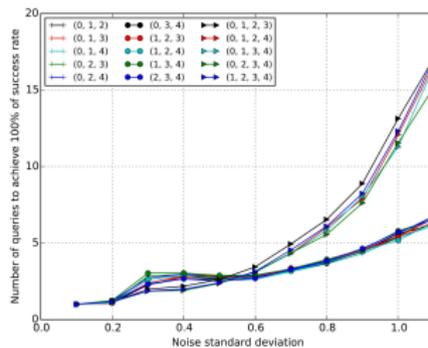


Figure: # of observations to achieve a 100% success rate vs the noise std.



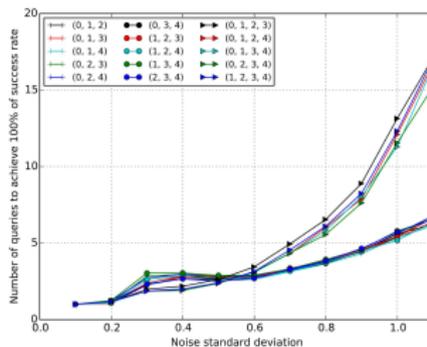


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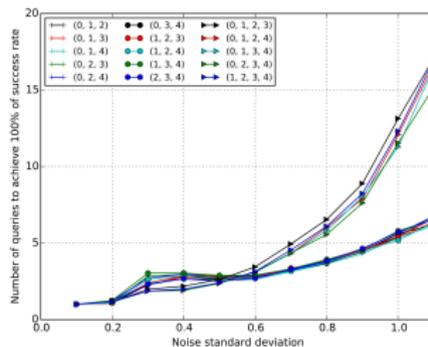


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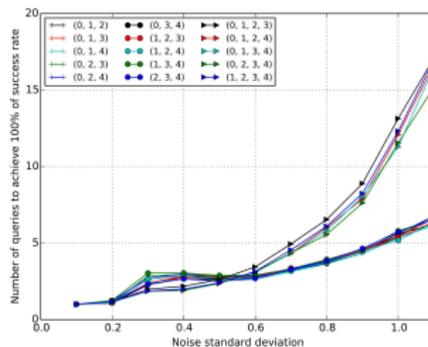


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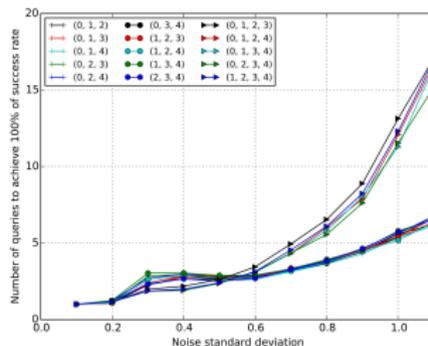


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- Only effective till' some noise amount!



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- In the paper, we combine this property with *GoubinMartinelli11* and *CastagnosRennerZémor13* to improve the efficiency of the secure multiplication over data shared with SSS *Ben-OrGoldwasserWigderson88*.



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 - ▶ it exists more efficient reconstruction schemes than Lagrange's interpolation *GuruswamiWootters16*



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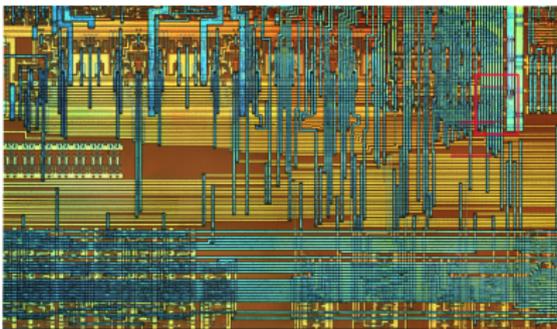
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- We used the theory of Linear Exact Repairing Schemes (LERS) to improve the secure multiplication between data shared with SSS
- More works needed to study how to design efficient LERS for given n and d





Thank you for your attention!
Questions/Remarks?

