

Pseudoentropy

PhD Dissertation Talk

University of Warsaw

May 23, 2023

This talk

- ✓ Overviews the goals, resources, and deliverables of my PhD project.
- ✓ Demonstrates/sketches interesting techniques used in the dissertation.
- ✓ Defends my position on the dissertation form, in view of reviews received 🛡️.
- ✗ Avoids complex definitions and proofs for brevity's sake (see the papers) ⌚.
- ✗ Does not assess my own academic KPIs (see the documentation) 😬.

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Credits

I am particularly grateful:

❤️ for love, to my wife Aneta

💰 for funding and know-how, to my advisor Stefan Dziembowski

💡 for merit support, to my co-advisor Krzysztof Pietrzak

👏 for motivation and recognition, to dozens of people with whom I shared ideas: research collaborators, reviewers, audience 😊

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My PhD research received support from numerous funding sources:



Ideas for Poland



WELCOME



TOCNeT



PRELUDIUM







+ several travel grants from various research institutions

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About Pseudoentropy



Introduced in [ILL89, HILL99] as a **computational variant of information-theoretic entropy**.



Recognized as a **useful tool and convenient language** in research around cryptography, computational complexity and information theory. Examples:



Pseudorandom generators from one-way functions [HILL99]






Computational Dense Model Theorem [RTTV08, Zha11], improving upon the result of Green-Tao-Ziegler



? Promising but messy: suffers from **contextual definitions** and **insufficiently developed foundations**.

Goals

My PhD project set these goals:






-  **improve understanding of foundational properties** of pseudoentropy notions
-  **demonstrate further technical applications**
-  optionally, identify **new inspirational application areas**

Contribution

Works presented under the scope of this PhD project:

- ✓ **obtained characterizations and manipulation rules** for pseudoentropy notions, using **convex analysis as a toolbox**
- ✓ **simplified some of existing technical proofs**, for instance of Dense Model Theorem and of Computational Simulators
- ✓ **developed machine-learning inspired framework** for proving computational indistinguishability

My self-assesment:

-  these works contributed to the goals ,  and  respectively.
-  goals were set broadly, leaving still room for improvement

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Background

-  Pseudoentropy at least k when the distribution behaves *nearly as well* as with information-theoretic (min)entropy k in *cryptographic games*.
-  Program-input games used in definitions
 - (a) Distinguish: discriminate between two distributions based on a sample.
 - (b) Predict: guess a sampled outcome
 - (c) Compress: successfully decode after decoding

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Outline

 Indistinguishability quantifies how close are two distributions under a given class of computationally bounded tests.

 What is the geometrical meaning of indistinguishability?

 Computational indistinguishability can be **characterized by inseparability by a class of feasible hyperplanes**. The margin of separation can be analytically characterized too!

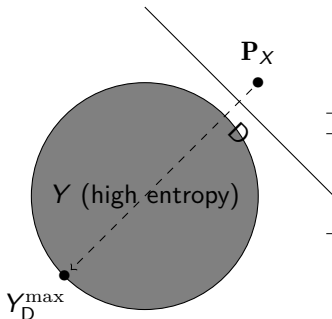
Contribution

The characterization has found the following applications:

- 🔑 Unifying unpredictability-based and indistinguishability-based pseudoentropy notions [SGP15]
- 🔑 Short proof of the Dense Model Theorem with optimal parameters [Sko15]
- 🔑 Further applications to key derivation [Sko17]
- 🔑 Simplifies other technical arguments [VZ12]

Technique (Sketch)

- 🔑 In program-input indistinguishability games it makes sense to **characterize the optimal input player Y** against a given program player D .
- 🔑 View D as a *separating hyperplane*, *maximize margin* with high-entropy Y
- 🔑 The characterization may be complicated, as it depends on:
 - (a) the class of feasible distinguishers
 - (b) the entropy notion (min/Renyi, conditional/unconditional etc)
- 🔑 Useful example: for min-entropy and boolean functions...



| Symbol/Operator | Crypto | Geometry |
|--|------------------------------|-----------------------------|
| X | candidate distribution | |
| $\text{ED}(Y)$ | expectation | $D \cdot P_Y$ (dot-product) |
| D | distinguisher/program player | separating hyperplane |
| Y | input player | feasible point |
| $\epsilon = \text{ED}(Y) - \text{ED}(X)$ | advantage | margin |

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Outline

- 📖 Applications of pseudoentropy use different notions, most commonly unpredictability-based and indistinguishability-based.
- ? Are unpredictability and indistinguishability entropies different?
Note: usually, distinguishing is easier than predicting¹
- 👉 Surprisingly, **equivalent in high-entropy regimes!**

¹Think of discriminating between dogs and cats versus predicting the breed. ▶ ◀ ≡ ≡ ≡ ↺ 🔍 ↻

Contribution

The following result was obtained [SGP15]:

-  **equivalence of unpredictability and indistinguishability** pseudentropy definitions in **high-entropy regimes**, namely $n - O(\log n)$ for n -bit strings,
-  **geometric characterizations as a workhorse** of the proof.

Technique (Sketch)

The proof strategy is to *constructively convert a distinguisher into a predictor*:

- (a) Indistinguishability fails: $\mathbf{ED}(X) \geq \mathbf{ED}(Y) + \epsilon$ for all Y of min-entropy k .
- (b) $\mathbf{ED}(X) \geq |\mathbf{D}|/2^k + \epsilon$ for boolean \mathbf{D} , by geometrical characterizations (!)
- (c) Sample \mathbf{A} from the image of \mathbf{D} , then $\mathbf{P}\{\mathbf{A} = X\} > 2^{-k} + \frac{\epsilon}{\#\mathbf{D}}$.
- (d) Approximate image sampling by rejection sampling ℓ times, then

$$\mathbf{P}\{\mathbf{A} = X\} > \left(2^{-k} + \frac{\epsilon}{\#\mathbf{D}}\right) \cdot \left(1 - \frac{\#\mathbf{D}}{2^n}\right)^\ell.$$

- (e) $\mathbf{P}\{\mathbf{A} = X\} > 2^{-k}$ when $\ell \approx 2^{n-k}/\epsilon$ independently of $\#\mathbf{D}$!



More sophisticated rejection-sampling handles X with auxiliary input Z .

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- 📖 Applications of pseudoentropy assume strength parameters that propagate through reduction proofs.
- ? Can we characterize what quality parameters are non-trivial?
- 👉 Yes, by time-advantage tradeoffs!

Contribution

The following result was obtained:

- 🔑 generic attacks with time t succeed against pseudoentropy amount k with advantage $\epsilon = O\left(\sqrt{t/2^k}\right)$
- 🔑 the result generalizes the famous time-advantage tradeoffs against pseudorandomness [DTT10]

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- 📖 Applications of pseudoentropy **heavily rely on manipulation rules**, particularly chain rules and transformations [BSW03, FOR12]. Their use **weakens security guarantees**.
- ? Can we improve known manipulation rules?
- 👉 No, not by black-box reductions!

Contribution

The following results were obtained:

-  **impossibility of better proofs** by black-box reductions!
-  the **probabilistic construction of an oracle**, of independent interest, inspired by earlier work limitations of dense model theorems [Zha11]

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- 📖 In security proofs it helps to model leakages as explicit functions of secrets.
- ? What leakages can be modelled, without substantial loss in security, as functions of secrets?
- 👉 Short leakages can be simulated!

Contribution

The following important results were obtained:

- 🔑 Construction of a simulator for m bits of leakage which makes only $2^{O(m)}\epsilon^{-2}$ calls to achieve ϵ -indistinguishability.
- 🏆 The reasoning, inspired by ML techniques, **builds on gradient descent** and was recognized with the *best student paper award at TCC*.

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Addressing Reviewers Feedback

R: Editorial changes and reference requests.

M: Addressed, thanks for the feedback!

R: A book-style dissertation would be better than a mixture of conference works.

M: I discussed this form with senior researchers, but found *ineffective*:

-  Gain citations! 🤔 *Time-consuming, better to keep writing papers.*
-  Get your PhD distinguished. 🤔 *Prestigious conferences not enough?*
-  Take your time to present it better! 🤔 *Why to work harder? We count conference works when granting junior/senior professorships!*

R: Parts of lengthy works might not have been fully reviewed at conferences.

M: Indeed, the same risk as in case of granted junior professorships 😊