

f -Divergences in Statistical Security Proofs

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Given two distributions \mathbf{P}, \mathbf{Q} over Ω , the statistical distance between them is:

$$\Delta_{\text{SD}}(\mathbf{P}; \mathbf{Q}) = \frac{1}{2} \sum_{x \in \Omega} |\mathbf{P}(x) - \mathbf{Q}(x)|$$

Useful properties:

- ① **Data-processing inequality:** Given a (randomised) function $g : \mathbb{R} \rightarrow \mathbb{R}$,

$$\Delta_{\text{SD}}(g(\mathbf{P}); g(\mathbf{Q})) \leq \Delta_{\text{SD}}(\mathbf{P}; \mathbf{Q}).$$

- ② **Probability-preservation property (PPP):** Given an arbitrary event $E \subseteq \Omega$:

$$|\mathbf{P}(E) - \mathbf{Q}(E)| \leq \Delta_{\text{SD}}(\mathbf{P}; \mathbf{Q}).$$

- ③ **Tensorisation (sub-additivity):** $\Delta_{\text{SD}}(\prod_i \mathbf{P}_i; \prod_i \mathbf{Q}_i) \leq \sum_i \Delta_{\text{SD}}(\mathbf{P}_i; \mathbf{Q}_i)$

- ④ **Triangle inequality:** $\Delta_{\text{SD}}(\mathbf{P}; \mathbf{R}) \leq \Delta_{\text{SD}}(\mathbf{P}; \mathbf{Q}) + \Delta_{\text{SD}}(\mathbf{Q}; \mathbf{R})$

- ⑤ **Symmetry:** $\Delta_{\text{SD}}(\mathbf{Q}; \mathbf{P}) = \Delta_{\text{SD}}(\mathbf{P}; \mathbf{Q})$

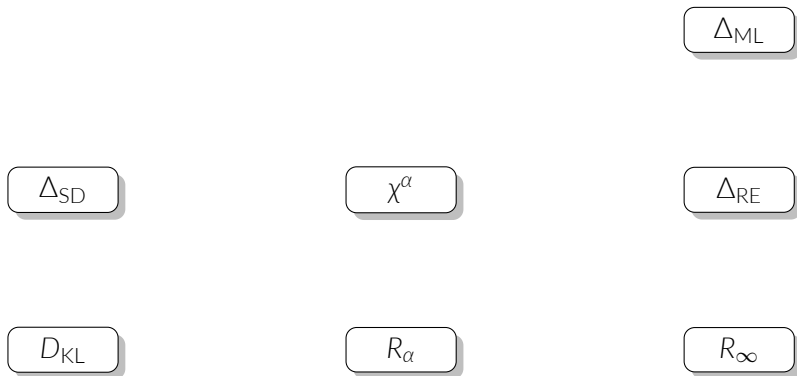


Figure 1: Relations between statistical distance (Δ_{SD}), Kullback-Leibler divergence (D_{KL}), χ^α divergence [Vaj73], Rényi divergence (R_α), max-log distance (Δ_{ML}), and relative error (Δ_{RE}).

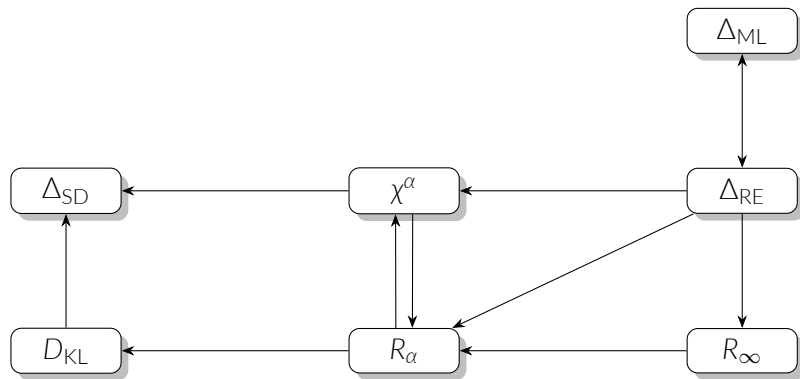


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$\boxed{X} \leftarrow \boxed{Y}$ means there exists an inequality of the form $X \leq g(Y)$.

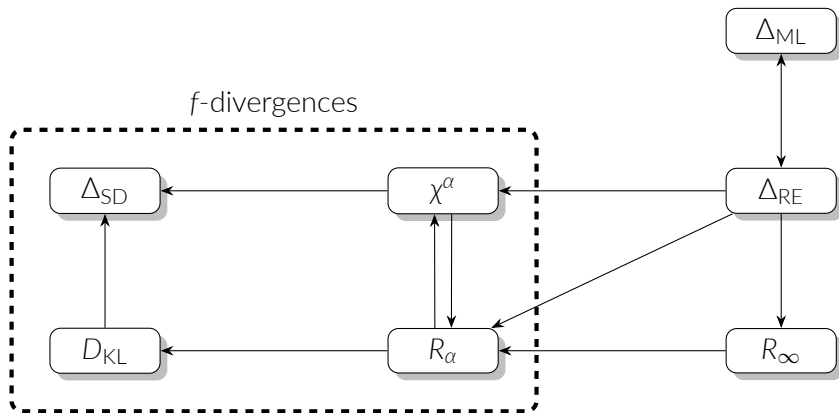


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f -divergence [Mor63, Csi63, AS66]

Let $f : \mathbb{R} \rightarrow \mathbb{R}$ be a convex function such that $f(1) = 0$.

The f -divergence between \mathbf{P} and \mathbf{Q} is:

$$\text{Div}_f(\mathbf{P}; \mathbf{Q}) = \mathbb{E}_{\mathbf{Q}} \left[f \left(\frac{\mathbf{P}}{\mathbf{Q}} \right) \right] = \sum_{x \in \text{Supp } \mathbf{Q}} f \left(\frac{\mathbf{P}}{\mathbf{Q}} \right) \quad (1)$$

- Statistical distance $\Delta_{SD}(\mathbf{P}; \mathbf{Q})$
 - $f(x) = \frac{1}{2}|x - 1|$
 - Ubiquitous in crypto
- Kullback-Leibler divergence $D_{KL}(\mathbf{P}; \mathbf{Q})$
 - $f(x) = x \ln x$
 - Ubiquitous in information theory, common in crypto
- Hellinger distance $H^2(\mathbf{P}; \mathbf{Q})$
 - $f(x) = (\sqrt{x} - 1)^2$
 - Probabilistic analog of the Euclidean distance
- Rényi divergence $R_\alpha(\mathbf{P}; \mathbf{Q})$
 - $R_\alpha^{\alpha-1} - 1$ is an f -divergence for $f(x) = x^\alpha - 1$
 - Common in lattice-based crypto

Besides a clean abstraction, f -divergences provide a few properties for free:

→ **Data-processing inequality:**

$$\text{Div}_f(g(\mathbf{P}); g(\mathbf{Q})) \leq \text{Div}_f(\mathbf{P}; \mathbf{Q}) \quad (2)$$

→ **Probability-preservation property (PPP):**

- Consequence of the data-processing inequality
- Set g so that $g(\mathbf{P})$ (resp. $g(\mathbf{Q})$) is the outcome (0/1) of a game

→ Joint convexity

But in general:

- No tensorisation
- No triangle inequality
- No symmetry

The statistical distance Δ_{SD} is a one-size-fits-all divergence, but not always the best:

- The Rényi (R_α) and Kullback-Leibler (D_{KL}) divergences are more tightly connected to {Shannon, collision, min-}entropies
- Hellinger, Kullback-Leibler and χ^2 divergences' tensorisation properties may provide tighter proofs
- The Rényi divergence has a multiplicative probability-preservation property

Rest of this talk: a few selected examples using the Rényi divergence.

Rényi divergence

Let \mathbf{P}, \mathbf{Q} such that $\text{Supp } \mathbf{P} \subseteq \text{Supp } \mathbf{Q} = \Omega$. The Rényi divergence of order $\alpha \in [1, \infty]$ between \mathbf{P} and \mathbf{Q} is defined, for $1 < \alpha < \infty$, as:

$$R_\alpha(\mathbf{P}; \mathbf{Q}) := \left(\sum_{x \in X} \frac{\mathbf{P}(x)^\alpha}{\mathbf{Q}(x)^{\alpha-1}} \right)^{\frac{1}{\alpha-1}}, \quad (3)$$

with the two limit cases $R_1(\mathbf{P}; \mathbf{Q}) = e^{D_{\text{KL}}(\mathbf{P}; \mathbf{Q})}$ and $R_\infty(\mathbf{P}; \mathbf{Q}) = \max_{x \in \Omega} \frac{\mathbf{P}(x)}{\mathbf{Q}(x)}$.

Properties: The Rényi divergence is sub-multiplicative (tensorisation) and verifies a weak triangle inequality, but is not symmetric.

Fun fact: the Shannon (H_1), collision (H_2) and min-entropy (H_∞) are part of the class of Rényi entropies H_α , which can be defined as:

$$H_\alpha(X) = \log_2 |\Omega| - \log_2 R_\alpha(\mathbf{P}; \mathbf{U}), \quad (4)$$

where $X \sim \mathbf{P}$, and \mathbf{U} is the uniform distribution over Ω .

Let $p = \mathbf{P}(E)$ and $q = \mathbf{Q}(E)$, so that $0 \leq p, q \leq 1$. This PPP is immediate from (2):

$$\frac{p^\alpha}{q^{\alpha-1}} + \frac{(1-p)^\alpha}{(1-q)^{\alpha-1}} \leq R_\alpha(\mathbf{P}; \mathbf{Q})^{\alpha-1}. \quad (5)$$

(5) admits two special cases:

→ An additive PPP [MTMH19]:

$$|p - q| \leq \sqrt{(R_2(\mathbf{P}; \mathbf{Q}) - 1) \cdot q} \quad (6)$$

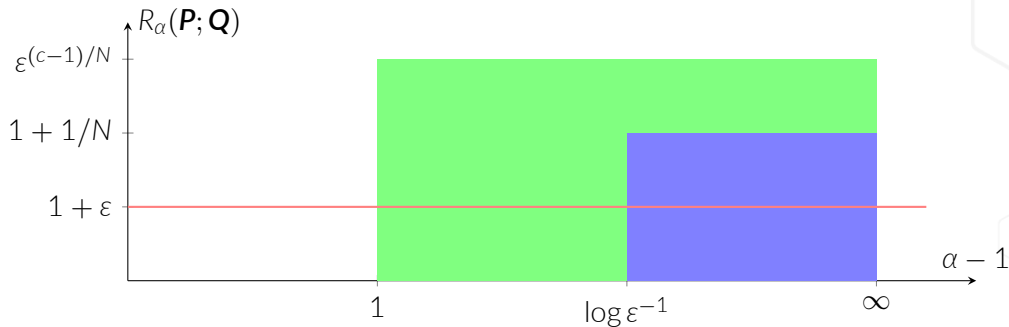
→ A multiplicative PPP [LSS14]:

$$p \leq (q \cdot R_\alpha(\mathbf{P}; \mathbf{Q}))^{(\alpha-1)/\alpha}, \quad (7)$$

$$p \leq q \cdot R_\infty(\mathbf{P}; \mathbf{Q}). \quad (8)$$

If N queries to \mathbf{P} (resp. \mathbf{Q}), replace R_α with R_α^N .

Let ε be the advantage when using \mathbf{Q} (search: $q = \varepsilon$, decision: $q = 1/2 + \varepsilon$). We want to upper bound the advantage when using \mathbf{P} . Assume N queries.



- **In green**: reductions with polynomial loss (c is a constant > 0)
 - For search problems using (7), see [BLL+15]
 - For decision problems with the public sampleability property [BLL+15, MTMH19]
- **In blue**: search reductions with $O(1)$ loss using (7), see [Pre17]
 - Decision \Rightarrow ad-hoc techniques, e.g. problem switching [NAB+20, DSSS21, LW21]:

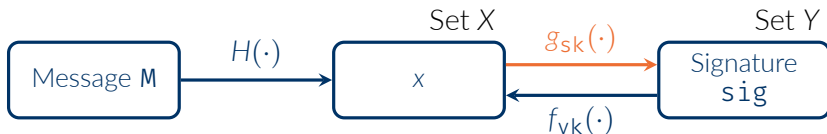
$$\text{IND-CPA} \Rightarrow \text{OW-CPA} \Rightarrow \text{IND-CCA}$$

(9)

- Below the red line (—): no real advantage over statistical distance

Application 1: Trapdoor Sampling

Most lattice-based H&S constructions [GPV08, MP12, DLP14, PFH⁺17] rely on trapdoor preimage sampleable functions (TPSFs).



We require that there exists \mathbf{Y} of support Y such that for almost all $x \in X$:

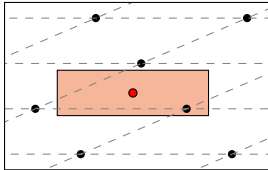
$$\{y \leftarrow \mathbf{Y} | f_{vk}(y) = x\} \approx_s \{y \leftarrow g_{sk}(x)\} \quad (10)$$

Fun fact/digression: relaxing (10) to hold *on average* over x unlocks more (efficient) constructions [CGM19, DST19, CD20].

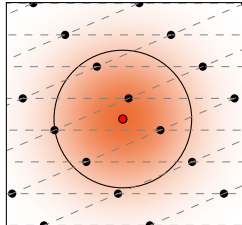
Question: Why does \approx_s matter in (10), and how do we assess it?

Most trapdoor samplers can be seen as randomised variants of (polynomial-time) approximate CVP solvers (e.g. Babai's *nearest plane* and *round-off* algorithms).

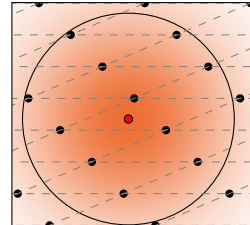
σ too small



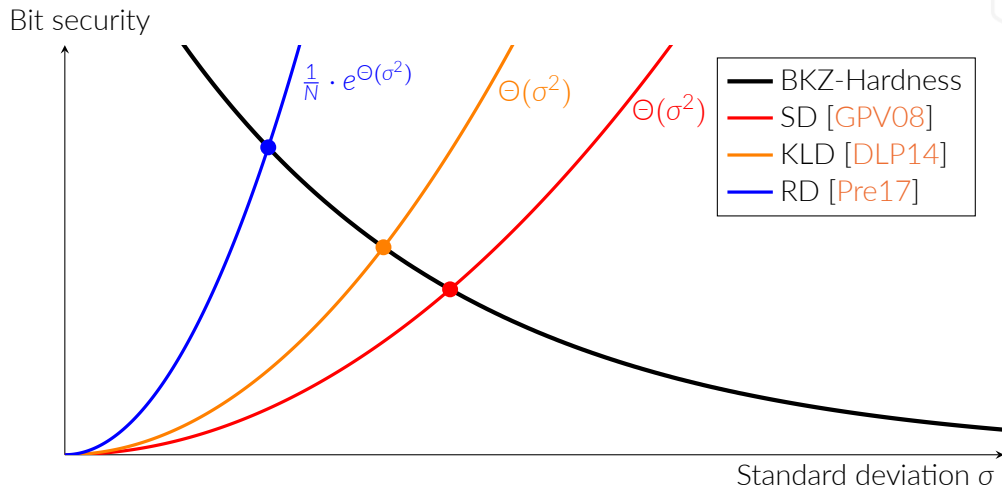
The "right" σ



σ too big



- 1 σ too small \Rightarrow vulnerable to learning attacks [NR06, DN12]
- 2 σ too large \Rightarrow suboptimal for cryptography



For Falcon [PFH⁺17] and $N = 2^{64}$, we gain ~ 30 bits of security (compared to SD).

Application 2: Prime Number Generation in RSA

In RSA, the public key is $p \cdot q$.

- Ideally, p, q should be uniform in some high-entropy interval, say $[0, 2^\ell)$
- In practice, most algorithms are very far from providing this guarantee

Can prime number generation be a point of failure in practice? Yes:

- 1 **Highly structured distributions:** p, q may be recovered by non-generic methods
 - ⚡ See Coppersmith's attack [Cop96] and its follow-up ROCA [NSS+17]
- 2 **Insufficient entropy:** distinct public keys may have common factors
 - ⚡ Compute pairwise GCDs to recover private keys [HDWH12, LHA+12, BCC+13, HFH16, BSTS16, AR18, Kil19]

This is why several prime number generators have been proposed [BD93, Mau95, JPV00, FT14, FT19].

A simple and popular (PyCrypto, OpenSSL) prime number generator.

PRIMEINC(l, s)

- 1 Sample odd p uniformly in $\{2^{\ell-1}, \dots, 2^\ell\}$, set $k \leftarrow 0$.
- 2 While $(k \leq s)$ & (p is not prime), set $p \leftarrow p + 2$ and $k \leftarrow k + 1$.
- 3 If (p is prime) & ($p < 2^\ell$), return p , else restart.

Is it secure?

→ Maybe?

$$\frac{H_1(\text{PRIMEINC}())}{H_1(\text{Uniform})} \xrightarrow{\ell \rightarrow \infty} 1$$

([BD93])

→ Maybe not?

$$\Delta_{\text{SD}}(\text{PRIMEINC}(); \text{Uniform}) \xrightarrow{\ell \rightarrow \infty} 0.86$$

([FT19])

Under appropriate conditions (mostly the same as [FT19]):

$$R_{\infty}(\text{PRIMEINC}(); \text{Uniform}) = 1 + O(1) \quad (11)$$

Consequence 1: From (8), an RSA-based scheme secure when p, q are sampled uniformly, remains secure (in the single-user setting) when $p, q \leftarrow \text{PRIMEINC}()$.

It follows from (11) that:

$$H_2(\text{PRIMEINC}()) \geq \ell - O(1) \quad (12)$$

Consequence 2: PRIMEINC is impervious against GCD/common factors attacks.

Conclusion

It is often fruitful to try other divergences than the statistical distance:

→ Rényi divergence

- Lattice-based cryptography [LSS14, BLL⁺15, Pre17]
- Differential privacy [Mir17, MTMH19]
- Prime number generators [AP20]
- Leakage-resilient cryptography [PGMP19]

→ Kullback-Leibler divergence is implicit in the definition of mutual information

→ Hellinger distance

- Key-alternating ciphers [Ste12]
- Strong randomness extractors [Yas21]

→ χ^2 divergence in symmetric cryptography [DHT17]

Not to mention relaxing [DST19, CD20] or strengthening [PGMP19] notions.

Thank You

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