

# AN AXIOMATIC APPROACH TO QUANTITATIVE INFORMATION FLOW

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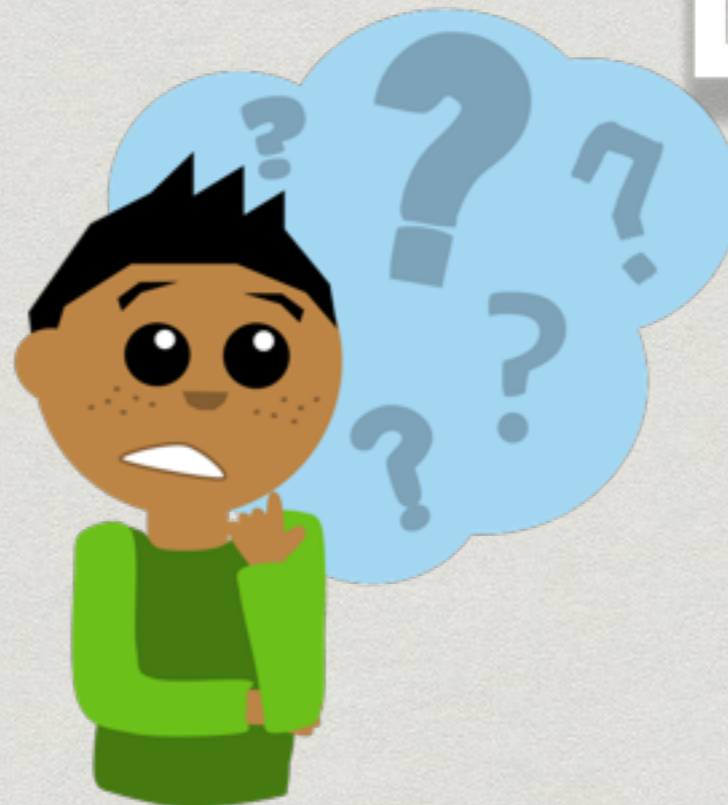
# Quantitative information flow: **vulnerability** of a secret

Shannon entropy

guessing entropy

Rényi min-entropy

g-vulnerability



# g-vulnerability

(talks by Geoffrey and Carroll)

- \* General: it encompasses the most used notions (Shannon, guessing, min-vulnerability,...)
- \* Operational interpretation: the gain functions express the gain of the adversary
- \* Some useful properties:
  - \* Min-leakage is an upper bound to g-leakage
  - \* The robust leakage ordering (w.r.t. all gain functions and all priors) coincides with the post-processing ordering
- \* but... does *g*-vulnerability represent all conceivable kinds of vulnerability ?

# A principled approach

- \* What are the properties that any “reasonable” notion of vulnerability should have?
- \* Notation:
  - \*  $X, Y$  random variables (secrets, observables)
  - \*  $C : X \rightarrow Y$  channel (system)
  - \*  $\mathbb{V}(X)$  prior vulnerability of  $X$
  - \*  $\mathbb{V}(X|Y)$  posterior vulnerability of  $X$  given  $Y$

# Axioms of vulnerability I

Let  $C : X \rightarrow Y$  and  $D : Y \rightarrow Z$

- \* Data Processing Inequality (DPI)

$$\mathbb{V}(X | Z) \leq \mathbb{V}(X | Y)$$

- \* Non-Negativity of leakage (NN)

$$\mathbb{V}(X) \leq \mathbb{V}(X | Y)$$

# Axioms of vulnerability II

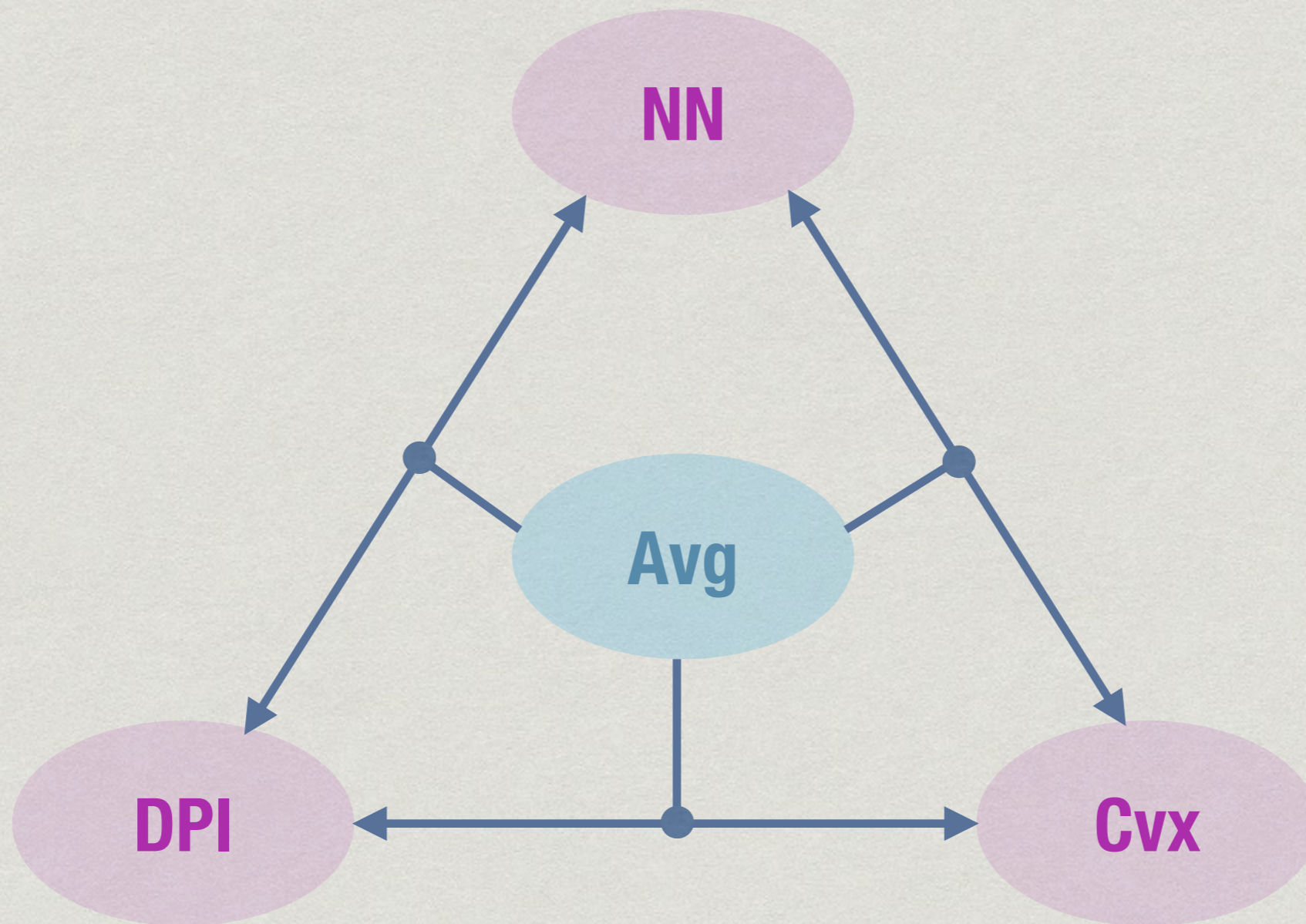
Let  $\pi$  be the distribution of  $X$  (prior)  
and  $p$  be the distribution of  $Y$  (posterior)

- \* Convexity (Cvx)

$$\mathbb{V}(c\pi + (1-c)\pi') \leq c\mathbb{V}(\pi) + (1-c)\mathbb{V}(\pi')$$

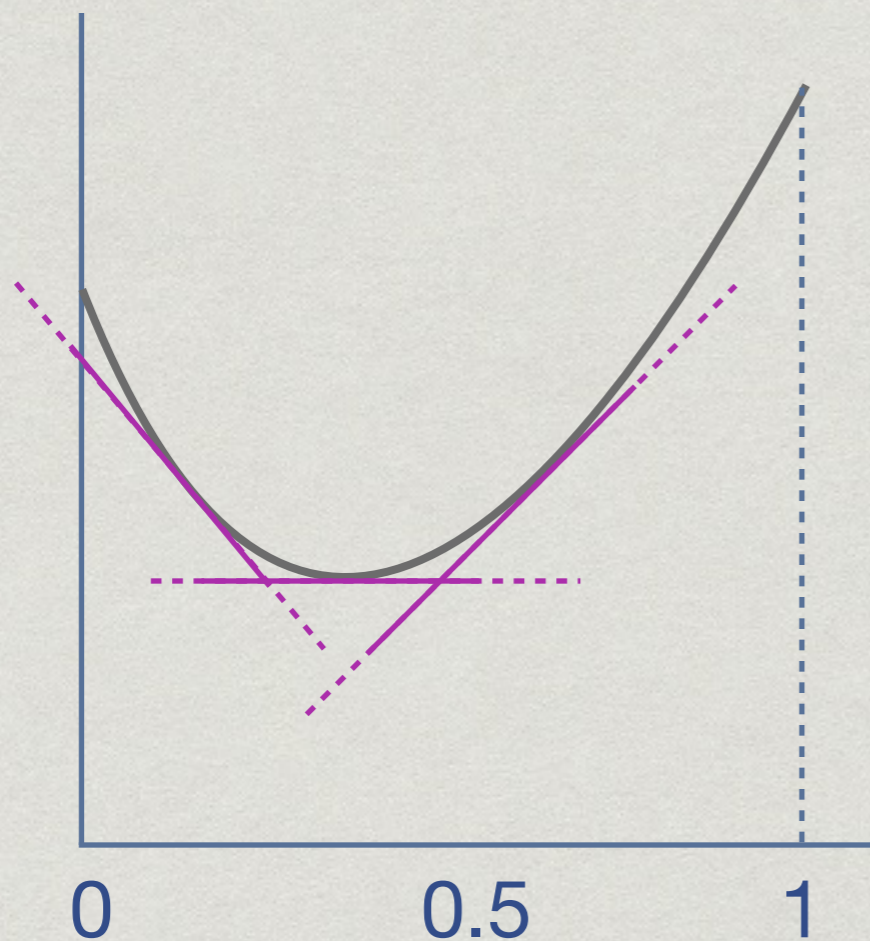
- \* Averaging (Avg)

$$\mathbb{V}(X | Y) = \sum_y p(y) \mathbb{V}(X | Y=y)$$



If we assume Avg, the other three axioms are equivalent

# Convexity implies g-vulnerability



$$\mathbb{V}_g(\pi) = \max_w \sum_x \pi(x) g(x, w)$$

Posterior g-vulnerability is defined by averaging



# Additional axioms to obtain Shannon entropy

$$\text{Relation: } H(X) = \mathbb{V}_{\max|X|} - \mathbb{V}(X)$$

- \* Symmetry:  
if the distributions of  $X$ ,  $X'$  have the same probability values, modulo permutation, then  
 $H(X) = H(X')$

- \* Chain rule:  
 $H(X, Y) = H(X | Y) + H(Y)$

Note that the chain rule together with symmetry imply the reversibility of information leakage (which is not valid, in general, for g-vulnerability) :

$$\mathbb{V}(X | Y) - \mathbb{V}(X) = \mathbb{V}(Y | X) - \mathbb{V}(Y)$$

typical definition of leakage

Thank you