

Adversarial Leakage in Games

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Joint work with

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Theorem (von Neumann, 1928)

$$\max_{p \in \Delta(m)} \min_{j \in [n]} \sum_{i \in [m]} p(i) \cdot M_{i,j} = \min_{q \in \Delta(n)} \max_{i \in [m]} \sum_{j \in [n]} q(j) \cdot M_{i,j} .$$

This is defined to be the value of the game, denoted $v(M)$ = the probability that ROW wins.



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- **Question 1:**
what should ROW do now that she knows that COL may learn b bits of information about her pure action?



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- **Question 1:**
what should ROW do now that she knows that COL may learn b bits of information about her pure action?
- **Question 2:**
what happens to the value of the game (probability that ROW wins)?

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ROW wins (step (5)) iff $M_{i,g(f(i))} = 1$.

New game values

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The value of the game M under b leaking bits in the **strong** model:

$$v^s(M, b) = \max_{p \in \Delta(m)} \min_{f: [m] \rightarrow \{0,1\}^b} \min_{g: \{0,1\}^b \rightarrow [n]} \sum_{i \in [m]} p(i) \cdot M_{i, g(f(i))} .$$

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Clearly, $v^s(M, b) \leq v^w(M, b) \leq v(M)$ for every game M and $b \geq 0$.

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it is $\geq 1/2$ as long as $b \leq \lg(1/\epsilon) - 1$;
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There exists an infinite sequence of games $M \in \{0, 1\}^{m \times m}$, $v(M) = q(1 \pm o(1))$, so that if $b \leq \lg \lg(m) - O(1)$, then $v^s(M, b) \geq q^{2^b}(1 \pm o(1))$.



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- $M_{u,v} = 1$ iff the vectors u and v are **orthogonal** over $GF(2)$.

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- Indeed, requiring that $M_{u,v} = 1$ for every $v \in J$ yields a homogeneous system of $|J|$ **linear equations** over $GF(2)$ in r variables; it has $\geq 2^{r-|J|} - 1$ non-zero solutions.
- Playing the uniform distribution on $[m]$ implies the desired
$$v^s(M, b) \geq \frac{2^{r-|J|}-1}{m} \geq \left(\frac{1}{2}\right)^{2^b} (1 - o(1)).$$

Weak leakage

Theorem

For every fixed $0 < q < 1$ and $0 < \delta < 1$, and for all sufficiently large m , there exists a game $M \in \{0, 1\}^{m^2 \times m}$ so that:

- (1) $v(M) = q + o(1)$; and
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it stays close to $v(M)$ as long as $b \leq \lg \lg(m) - O(1)$;

it drops to 0 once $b \geq \lg \lg(m) + O(1)$.

Computational complexity

Theorem

Given a game $M \in \{0, 1\}^{m \times n}$ and some $b \geq 0$, both $v^s(M, b)$ and $v^w(M, b)$ are *NP-hard* to approximate to within any factor.

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Reducing **set cover** to the problem of deciding whether the (strong or weak) value is strictly positive.

When b is **fixed**, computing $v^s(M, b)$ becomes tractable:

Theorem

Given a game $M \in \{0, 1\}^{m \times n}$, the optimal mixed strategy p_b^* can be **efficiently** computed.

► conclusions

Polynomial algorithm for constant b

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Would like to solve the LP

maximize v s.t.

$$\sum_{i \in [m]} p_i \cdot M_{i,g(f(i))} \geq v \quad \forall f : [m] \rightarrow \{0,1\}^b, \forall g : \{0,1\}^b \rightarrow [n]$$

$$\sum_{i \in [m]} p_i = 1$$

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h_J simply maps each row $i \in [m]$ to the column $j \in J$ that **minimizes** $M_{i,j}$.

Polynomial algorithm for constant b — cont.

Sufficient to solve the LP

maximize v s.t.

$$\sum_{j \in J} \sum_{i: h_J(i)=j} p_i \cdot M_{i,j} \geq v \quad \forall J \subseteq [n], |J| \leq 2^b$$

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Size = **polynomial** when b is fixed.

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