# Coalition-Resistant Peer Rating for Long-Term Confidentiality

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#### **Context and Motivation**

Contributions Score Inaccuracy for Unincentivised Ratings Score Accuracy for Incentivised Ratings Conclusions

## Context & Motivations

#### Context: Information-theoretic confidentiality

- Sensitive data require long-term confidentiality
- Currently used cryptography is unsuitable for long-term confidentiality
- Threats: cryptanalatic progress, quantum computers
- Long-term solution: information-theoretic confidentiality
- Can be realised through secret sharing

# Context: Proactive secret sharing for long-term confidentiality

- Especially suitable for long-term confidentiality: proactive secret sharing
- Periodic renewal of shares
- Resilient to mobile adversary (collects shares over time)

#### Context: Distributed storage with different SSPs

- In an outsourcing scenario, proactive secret sharing can be performed on distributed storage system
- Distributed storage system consists of several Storage Service Providers (SSPs)
- Avoids single point of failure (single SSP key management)
- In practice, reliable proactive secret sharing requires high-performing SSPs
- ▶ We define *high-performing* in a broad sense; includes reliability

#### Context: Selecting high-performing SSPs

- How to select high-performing SSPs to build distributed storage system?
- Data owners require reliable guidance for this choice pointed out by NIST for the special case of cloud infrastructures (NIST-SP 500-291)
- Data owners do not have access to comprehensive performance figures

### Context: Obtaining SSP performance figures

- Use a third party to measure and publish performance figures?
- Impractical for a large number of SSPs and frequent measurements
- Alternative: aggregated peer rating SSPs rate each other's performances. Third party also present, but only as a mediator: only aggregates ratings.

#### Motivation: Rational SSPs and accuracy

- Problem: SSPs benefit from providing selfish/false performance ratings to undermine competitors
- Naively computed aggregated performance scores unreliable
- For accuracy, need performance scoring mechanism encouraging accurate ratings
- Must model SSPs as rational agents rather than "good"/"bad"
- Natural framework for analysis of rational behaviour: game theory

# Contributions

#### Contributions — Summary

- 1. Formalisation of computation of aggregate performance scores in game-theoretic framework. Game-theoretic model of SSP peer rating strategies
- 2. Formalised example of how unincentivised performance scoring mechanisms result in SSPs reporting inaccurate ratings
- Incentivised performance scoring mechanism with incentive/penalty for accurate/inaccurate ratings, using a TA. Assuming honest majority, accuracy resilient to coalitions (coordinated groups) of SSPs
- 4. Model of this mechanism as an infinitely repeated game in game-theoretic formalism, and proof of k-resilient equilibrium

#### Contributions — Remarks

- ▶ We do not aim at cryptographically improving proactive secret sharing
- Rather, focus is decision support for the selection of high-performing SSPs storing shares
- This supports reliable long-term confidential data storage
- We first show that aggregate performance scores are not accurate if participating SSPs are not incentivised to report faithfully
- ▶ We then present incentivised scoring mechanism + accuracy proof
- Accuracy margin depends on coalition sizes

#### Game-theoretic framework (1)

- ► Idea: game-theoretic formalism models peer rating strategies of the SSPs ("players") P<sub>1</sub>...P<sub>n</sub>
- $A_i$  is the set of possible actions of player  $P_i$
- Action profile:  $\mathcal{A} = \mathcal{A}_1 \times \cdots \times \mathcal{A}_n$
- Utility function  $u_i : \mathcal{A} \to \mathbb{R}$  of a player defines its preferences
- ▶ Strategy  $\sigma_i : A_i \rightarrow [0, 1]$  for a player  $P_i$ : probability distribution
- Game denoted  $\Gamma(P_i, \sigma_i, u_i)$ , for  $i = 1, \ldots, n$

### Game-theoretic framework (2)

- Players act rationally: they always play the strategy maximising their utilities
- Non-cooperative game: players choose actions individually
- Cooperative game: players form coordinated coalitions

## Game-theoretic framework (3)

Notation:  $(\sigma'_{C}, \sigma_{-C}) = (\sigma'_{1}, \dots, \sigma'_{|C|-1}, \sigma'_{|C|}, \sigma_{|C|+1}, \dots, \sigma_{n})$  — players in coalition play strategy  $\sigma'$ , outsiders play  $\sigma$ 

Strategy  $\sigma$  dominates strategy  $\sigma'$  if it always provides its player with a higher utility (pay-off). Denoted  $\sigma' \leq \sigma$  (weak) or  $\sigma' < \sigma$  (strict)

For cooperative games, we use notion of k-resilient equilibrium:

A joint strategy  $\boldsymbol{\sigma} = (\sigma_1, \dots, \sigma_n)$  is a k-resilient equilibrium if  $u_i(\boldsymbol{\sigma}'_C, \boldsymbol{\sigma}_{-C}) \leq u_i(\boldsymbol{\sigma}_C, \boldsymbol{\sigma}_{-C})$ , for each subset  $C \subset \{P_1, \dots, P_n\}$  of cardinality  $n_C \leq k$ , where  $\sigma'_i \neq \sigma_i$ , for  $P_i \in C$ .

 $\sigma$  yields best pay-off for coalition members, for coalitions of size up to k

#### Score inaccuracy for unincentivised ratings

- ▶ Assume that TA computes aggregate score of each  $P_i$  by simply taking into account raw ratings from  $P_j$ ,  $J \neq i$ ,  $1 \leq i \leq n$ , i.e. by averaging them
- Aggregate scores output to data owner upon request
- We show formally that such unincentivised score computation does not lead to accurate aggregate scores
- Shown both for the case of non-cooperating and cooperating players
- Proof strategy: consider a number of rating strategies for players, including the one where accurate ratings are given. Show that giving faulty low ratings to all other players is the dominant strategy when goal is to maximize own aggregate score

#### Outline of new performance scoring mechanism

- At round r, each aggregate score τ<sup>r</sup><sub>i</sub> for P<sub>i</sub> is computed as convex combination of components τ<sup>r</sup><sub>i</sub>, τ<sup>r</sup><sub>i</sub> and τ<sup>r-1</sup><sub>i</sub> (for 1 ≤ i ≤ n)
- $\tau'_i$  is aggregate score of all ratings submitted by all players for player  $P_i$  being rated for current round r
- τ''<sub>i</sub> is aggregate score of incentives and penalties given to P<sub>i</sub> by TA
   for accurate/inaccurate ratings for current round r see next slide
- *τ<sub>i</sub><sup>r−1</sup>* is aggregate score of *P<sub>i</sub>* at previous round (*r* − 1), previously computed

Notation: round *r* implicit for  $\tau'_i$  and  $\tau''_i$ 

#### Performance scoring mechanism: computing $\tau_i''$

Notation:  $\rho_{i,j}^r$  = rating submitted by  $P_i$  about  $P_j$  for round r

#### Computing the second component $\tau_i''$

- 1.  $t_{\varepsilon}$  arbitrarily selected before the mechanism starts
- 2. Select incentive  $\alpha$  and penalty  $\beta$  with  $0 < \alpha \le t_{\varepsilon}$  and  $-t_{\varepsilon} \le \beta < 0$
- 3. For all *j* such that  $1 \le j \ne i \le n$ , compute  $o_{i,j} = \begin{cases} \alpha, & \text{if } |\tau'_j - \rho^r_{i,j}| \le t_{\varepsilon} \\ 0, & \text{if } t_{\varepsilon} < |\tau'_j - \rho^r_{i,j}| \le 2t_{\varepsilon} \\ \beta & \text{if } |\tau'_j - \rho^r_{i,j}| > 2t_{\varepsilon} \end{cases}$ (penalize outlier ratings by  $P_i$  about  $P_j$ ) 4.  $\tau''_i = \frac{1}{n-1} \sum_{j=1}^{n-1} o_{i,j}$  (averaging over *j*)

#### Some more formalism

Weight of player  $P_j$  w.r.t. evaluation of  $P_i$ :  $w_{j,i}^r = \frac{\tau_j^{r-1}}{\sum_{l \neq i} \tau_l^{r-1}}$ , with  $\sum_{j \neq i} w_{j,i}^r = 1$ , i.e. empower highly-rated players

In performance scoring mechanism, parameter  $\varepsilon$  (weight threshold) computed. Limits the weight of a coalition against all others. Depends on coalition size  $C_k$ 

#### Utility functions

Let 
$$M = \{m \mid P_m \in C_k\}$$
 and  $L = \{I \mid P_I \notin C_k\}$ .

Utility function for player  $P_i$  in coalition  $C_k$  with respect to aggregate scores, with  $|C_k| = n_k$ ,  $1 \le i \le n$ :

$$u_i(r) := \begin{cases} \frac{1}{n_k} \sum_{m \in M} \tau_m^r > \frac{1}{n - n_k} \sum_{l \in L} \tau_l^r \Longrightarrow u_i(r) = 1\\ \frac{1}{n_k} \sum_{m \in M} \tau_m^r = \frac{1}{n - n_k} \sum_{l \in L} \tau_l^r \Longrightarrow u_i(r) = 0\\ \frac{1}{n_k} \sum_{m \in M} \tau_m^r < \frac{1}{n - n_k} \sum_{l \in L} \tau_l^r \Longrightarrow u_i(r) = -1 \end{cases}$$

Coalition members want to be better rated on average than outsiders

#### Score accuracy for incentivised ratings

#### Main result (Theorem 2)

Let  $\varepsilon > 0$  be a weight threshold and let  $C_k$  be the biggest coalition for  $\varepsilon$ , with  $|C_k| = K$ . The infinitely repeated cooperative game  $\Gamma(P_i, \sigma_i, u_i)$ , for i = 1, ..., n, with utility  $u_i(r)$  and the above mechanism run at every round, reaches a *K*-resilient equilibrium for the computations of aggregate scores  $\tau_1^r, \ldots, \tau_n^r$  if

$$\frac{\sum_{i\in C_k} w_{i,m}^r}{\sum_{j\notin C_k, j\neq m} w_{j,m}^r} \leq \varepsilon.$$

### Score accuracy for incentivised ratings — Interpretation

Infinitely repeated: players do not know when last round happens

Honest majority assumed

Weight of biggest coalition  $C_k$  bounded depending on accuracy threshold  $t_{\varepsilon}$ 

Unfair (selfish) ratings deviating from accurate mainstream are detected

Unfair raters penalized w.r.t. own rating

It pays to rate accurately!

## Conclusions



- Performance scoring mechanisms can be resilient to coalitions of rational SSPs if majority of SSPs is honest
- Guiding data owners in their SSP selection supports long-term confidentiality
- Experimental validation needed to estimate average number of rounds for aggregate scores to converge

#### Thank You!

## Questions?