Fault-Tolerant Secret Key Generation

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Formulation An Upper Bound

Multiterminal Source Model



Set of nodes: $\mathcal{M} = \{1, ..., m\}$

- Observations of the *i*th node: $X_i^n = (X_{i1}, ..., X_{in})$
- Denote by $X_{\mathcal{M}t}$ the correlated rvs $(X_{1t}, ..., X_{mt})$
- ► X_{M1},..., X_{Mn} are finite, discrete valued, i.i.d. rvs - with known probability distribution.







Available Nodes: $A_0 = \mathcal{M}$



Formulation

An Upper Bound

Symmetric Observations Exchangeablity PIN Model



Nodes Remaining: $A_1 = \{1, 2, 3, 4, 5, 6, 7\}$

Communication in round j depends on:

local observations and the communication in the previous rounds.





An Upper Bound

Symmetric Observations Exchangeablity PIN Model



Nodes Remaining: $A_2 = \{2, 3, 4, 6, 7\}$

Communication in round j depends on:

local observations and the communication in the previous rounds.





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Nodes Remaining: $A_{r-1} = \{2, 4, 6\}$

Communication in round j depends on:

local observations and the communication in the previous rounds.





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Symmetric Observations Exchangeablity PIN Model



Nodes Remaining: $A_{r-1} = \{2, 4, 6\} = A_r$

Communication in round j depends on:

local observations and the communication in the previous rounds.

Assumption: $A_r = A_{r-1}$





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Symmetric Observations Exchangeablity PIN Model



Communication in round j depends on:

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Assumption: $A_r = A_{r-1}$

The overall communication depends on $A_r = A_{r-1} \subseteq ... \subseteq A_1$

- ${\bf F}$ denotes the overall communication.





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Symmetric Observations Exchangeablity PIN Model



K constitutes a secret key if:

1. Recoverability: $\Pr(K_i = K, i \in A_r) \approx 1$

2. Security: $I(K \wedge \mathbf{F}) \approx 0$

The rate of the SK: $\frac{1}{n}H(K)$





An Upper Bound

Symmetric Observations Exchangeablity PIN Model



Definition (Achievable (r, t)-fault-tolerant SK rate)

 $R\geq 0$ is an achievable (r,t)-fault-tolerant SK rate if there is an r-rounds adaptive protocol that generates an SK of rate greater than R whenever not more than t nodes drop out.





An Upper Bound

Symmetric Observations Exchangeablity PIN Model



K constitutes a **perfect** secret key if:

1. **Perfect** Recoverability: $\Pr(K_i = K, i \in A_r) = 1$

2. Perfect Security: $I(K \wedge \mathbf{F}) = 0$

The rate of the SK: $\frac{1}{n}H(K)$





An Upper Bound

Symmetric Observations Exchangeablity PIN Model



Definition (Achievable (r, t)-fault-tolerant **perfect** SK rate)

 $R\geq 0$ is an achievable (r,t)-fault-tolerant **perfect** SK rate if there is an r-rounds adaptive protocol that generates a **perfect** SK of rate greater than R whenever not more than t nodes drop out.



Fault-Tolerant Secret Key Capacity

Formulation

An Upper Bound

Symmetric Observations Exchangeablity PIN Model

(r, t)-fault-tolerant SK capacity $C^{r,t}(\mathcal{M})$:

Supremum of all achievable (r, t)-fault-tolerant rates.

(r,t)-fault-tolerant perfect SK capacity $C_0^{r,t}(\mathcal{M})$:

Supremum of all achievable (r, t)-fault-tolerant perfect SK rates.

Lemma

For $r \geq 1$,

$$C_0^{1,t}(\mathcal{M}) \le C^{r,t}(\mathcal{M}) \le C^{r+1,t}(\mathcal{M}).$$



An Upper Bound on Fault-Tolerant SK Capacity

Theorem (Csiszár-Narayan 2004)

Formulation

An Upper Bound

Symmetric Observations Exchangeablity PIN Model The secret key capacity (for t=0) is given by

$$C(\mathcal{M}) = H(X_{\mathcal{M}}) - \min(R_1 + R_2 + \dots + R_m),$$

where the min is taken over $(R_1, ..., R_m)$ that satisfy:

$$\sum_{i \in B} R_i \ge H\left(X_B \mid X_{\mathcal{M} \setminus B}\right), \qquad B \subsetneq \mathcal{M}.$$

 \min value above is the minimum rate of communication for omniscience.

Lemma (Upper Bound on $C^{r,t}(\mathcal{M})$)

$$C_0^{1,t}(\mathcal{M}) \le C^{r,t}(\mathcal{M}) \le C^{r+1,t}(\mathcal{M}) \le \min_{\substack{A \subseteq \mathcal{M} \\ |A| \ge m-t}} C(A), \qquad r \ge 1.$$

Proof Idea: Consider the sequence of sets $A_1 = ... = A_{r-1} = A_r = A$.



Monotonicity of SK Capacity

Theorem (Chan-Zheng 2010)

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$$C(\mathcal{M}) = \min_{\mathcal{P} = \{C_1, ..., C_k\}} \frac{1}{k} D(X_{\mathcal{M}} || X_{C_1} . X_{C_2} ... X_{C_k}),$$

where the minimization is over all partitions \mathcal{P} of \mathcal{M} .

Lemma (Monotonicity of $C(\mathcal{M})$)

$$C(\mathcal{M}) \ge \min_{\substack{A \subseteq \mathcal{M} \\ |A|=m-1}} C(A).$$

Lemma (Upper Bound on $C^{r,t}(\mathcal{M})$)

$$C_0^{1,t}(\mathcal{M}) \le C^{r,t}(\mathcal{M}) \le C^{r+1,t}(\mathcal{M}) \le \min_{\substack{A \subseteq \mathcal{M} \\ |A| = m-t}} C(A), \qquad r \ge 1.$$



Is this Upper Bound Tight??

Formulation

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Symmetric Observations

Exchangeablity PIN Model

Lemma (Upper Bound on $C^{r,t}(\mathcal{M})$)

$$C_0^{1,t}(\mathcal{M}) \le C^{r,t}(\mathcal{M}) \le C^{r+1,t}(\mathcal{M}) \le \min_{\substack{A \subseteq \mathcal{M} \\ |A| = m-t}} C(A), \qquad r \ge 1.$$



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Lemma (Upper Bound on $C^{r,t}(\mathcal{M})$)

$$C_0^{1,t}(\mathcal{M}) \le C^{r,t}(\mathcal{M}) \le C^{r+1,t}(\mathcal{M}) \le \min_{\substack{A \subseteq \mathcal{M} \\ |A| = m-t}} C(A), \qquad r \ge 1.$$

Yes.

When the observations of the nodes are symmetric



Exchangeable Random Variables

Formulation

An Upper Bound

Symmetric Observations Exchangeablity PIN Model
$$\begin{split} \mathbf{P}_{X_1,...,X_m} &= \mathbf{P}_{X_{\sigma(1)},...,X_{\sigma(m)}}, \text{ for all permutations } \sigma \text{ of } \{1,...,m\} \end{split}$$
For disjoint sets B_1, B_2 : $H\left(X_{B_1}|X_{B_2}\right)$ depends only on $|B_1|, |B_2|$ Define: $g(i|j) = H\left(X_1,...,X_i|X_{i+1},...,X_{i+j}\right)$

Lemma (Minimum Rate of Communication for Omniscience)

For

$$\alpha_m = \frac{g(m-1|1)}{m-1}$$

 $(\alpha_m,...,\alpha_m)$ is an optimal rate-vector for omniscience, i.e., $R_{CO} = m\alpha_m$.

Lemma

 α_m is nonincreasing in m.

Proof: Uses properties g(i|j) inherited from $H(\cdot)$.



2-rounds adaptive protocol:

- 1. Each node communicates using random mapping of rate α_m .
 - $A_1 =$ set of nodes that communicate in round 1, $|A_1| = k$

An Upper Bound

Symmetric Observations Exchangeablity PIN Model 2. Nodes in A_1 send further communication of rate $\alpha_k - \alpha_m$ - if $A_2 \neq A_1$ the protocol fails.

Observation: Two random mappings of rates R_1 and R_2 can serve as a single random mapping of rate $R_1 + R_2$ in (multiterminal) Slepian-Wolf coding.

Performance of the protocol:

- Nodes in $A_2 = A_1$ recover $X_{A_1}^n$
- Rate of communication $= k \alpha_k$
- Nodes in A_2 generate SK of rate $C(A_2)$



Formulation

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Theorem (Fault-Tolerant SK Capacity)

For exchangeable rvs, for $r \geq 2$,

$$C^{r,t}(\mathcal{M}) = \min_{\substack{A \subseteq \mathcal{M} \\ |A| = m-t}} C(A) = g(m-t|0) - \frac{(m-t)g(m-t-1|1)}{m-t-1}.$$



The Pairwise-Independent-Network Model



PIN Model



Ye-Reznik 2007, Nitinawarat et.al. 2010

 B_{ij} : unbiased bit corresponding to the edge e_{ij} Random Variables $\{B_{ij} : i, j \in \mathcal{M}\}$ are mutually independent.

• $X_i = \{B_{ij} \text{ corresponding to edges } e_{ij} \text{ incident on } i\}$



The Pairwise-Independent-Network Model

Formulation

An Upper Bound

Symmetric Observations Exchangeablity PIN Model Assumption: The graph G is complete

Symmetry: For $B_1 \cap B_2 = \emptyset$, $H(X_{B_1}|X_{B_2})$ depends only on $|B_1|, |B_2|$.

$$C_0^{1,t}(\mathcal{M}) \le C^{2,t}(\mathcal{M}) = g(m-t|0) - \frac{(m-t)g(m-t-1|1)}{m-t-1} = \frac{m-t}{2}$$



Generating 1-bit Fault-Tolerant SK

Formulation

An Upper Bound

Symmetric Observations Exchangeablit PIN Model Assume that G is a (t + 1)-connected, spanning graph.

Noninteractive protocol to generate 1-bit of fault-tolerant SK:



For $A \subseteq \mathcal{M}$ with $|A| \ge m - t$: let e_A be an edge between nodes in A. *Claim:* $H(B_{e_A} | (F_A, X_i)) = 0$ and $I(B_{e_A} \land F_A) = 0$, $i \in A$.

 B_{eA} constitutes a 1-bit SK for A



Generating 1-bit Fault-Tolerant SK

Assume that G is a (t + 1)-connected, spanning graph.

An Upper Bound

Observations Exchangeablity PIN Model Noninteractive protocol to generate 1-bit of fault-tolerant SK:



This noninteractive protocol generates $1\mbox{-bit SK}$ for each spanning tree.

Nitinawarat et.al. use the interactive protocol of Csiszár-Narayan.



Assumption: The graph G is complete

Symmetric Observations Exchangeablity PIN Model Noninteractive protocol above gives 1-bit of SK for each spanning tree Find a "fault-tolerant" spanning tree packing

- sufficiently many spanning trees must remain when nodes drop out
- Consider n = 2: Any two nodes share 2 independent bits
- Can find a spanning tree packing such that:
 any subset A contains |A| spanning trees

Thus, a subset of size $\geq m - t$ can pack m - t spanning trees

Secret key rate attained: $\frac{m-t}{2}$





An Upper Bound

Symmetric Observations Exchangeablity PIN Model







An Upper Bound

Symmetric Observations Exchangeablit PIN Model



Theorem

For the PIN model corresponding to a complete graph,

$$C_0^{1,t}(\mathcal{M}) = C^{r,t}(\mathcal{M}) = \frac{m-t}{2}, \qquad r \ge 2.$$



An Alternative Protocol

A protocol to generate $\lfloor \frac{m}{2} \rfloor - t$ bits of SK for n = 1:

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Symmetric Observations Exchangeablity PIN Model First consider m even.

Tree remains connected if a leaf node drops out.

▶ Fix a matching in G.





An Alternative Protocol

A protocol to generate $\lfloor \frac{m}{2} \rfloor - t$ bits of SK for n = 1:

Formulation

An Upper Bound

Symmetric Observations Exchangeablit PIN Model First consider m even.

Tree remains connected if a leaf node drops out.

- ▶ Fix a matching in G.
- There is a spanning tree corresponding to each edge in the matching.





Future Directions

Formulation

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Symmetric Observations Exchangeablity PIN Model

- This work is a first step towards the larger goal of information-theoretic SK agreement for dynamic groups.
- Incorporate rejoining of terminals that drop out.
- What if the central switch has additional side information?