

# Capacity and security for imperfect batch steganography

**Abstract.** Batch steganography aims to conquer the limitations of capacity and security of data hiding with a single cover, and it is to spread secret information among a large number of covers, having improved basic algorithm and strategies of stegosystem. The steganographic features of batch covers and single cover were compared to propose a theoretic model for batch steganography. According to Kullback-Leibler divergence of batch steganography, the relationship of imperfect steganographic capacity with a formalized number of batch covers and embedding strategies was put forward. The maximum payload of an imperfect batch steganography (IBS) was determined by the number of batch covers and the base cover set and proved by formulations, and compared with capacity of noisy channels. The results show that the model under constraints of IBS is feasible for batch steganography. The research results are helpful for stegosystem design and steganalysis.

**Streszczenie.** Artykuł analizuje możliwości steganografii – metody szyfrowania nie tylko treści, ale także ukrywania w ogóle faktu obecności przesyłu wiadomości. (Możliwości i bezpieczeństwo niedoskonalej steganografii pakietowej)

**Keywords:** Steganography, Steganographic capacity, security, Steganalysis.

**Słowa kluczowe:** steganografia, bezpieczeństwo danych

## Introduction

The classic covert communication model is the “Prisoners’ Problem” proposed by Simmons [1]. In the model, Alice and Bob communicate without being detected by Warden Willie. Its focus is the security of the stegosystem and steganographic capacity [2,3]. Previous studies concentrated on efficient embedding and limitations of data into a single cover. Steganalysis can reduce the embedding capacity of steganography with a single cover, a method to increase steganographic capacity is batch steganography, which spreads secret information among a large set of covers. Ker [4] have proposed steganographic methods and segmented the basic theory of batch steganography. Fridrich [5,6] has proposed the methods of estimation capacity and a formal relationship [7] between maximum payloads and a number of covers on the security of stegosystems. Another research improved limitations, proposing a judged principle on the security of batch steganography, and establishing a theoretic foundation on hiding information [8].

These studies proposed theories for batch steganography but did not describe a basic theoretic model and essential condition of embedding strategies. They also did not present constraints on stegosystem security.

This paper investigates the basic theory of Kullback-Leibler (K-L) divergence [9], and proposes a theoretic model of an imperfect batch stegosystem and the constraints of security on a steganographic  $\epsilon$ -secure<sup>10</sup> definition. Giving covers of uniform capacity and a quantitative steganalysis method satisfying a hypothesis test and certain conditions of assumptions, the relationship and security were proved by formulation. Constructing a batch steganography model of information hiding, and proved system security, improve the ability of defense steganalysis.

The structure of this paper is as follows. Section 1 explains the theoretic models of batch steganography. Section 2 describes the capacity and security analysis of batch stegosystems with imperfect condition. Section 3 proves the relative equality for K-L divergence under certain assumptions. Section 4 is the experiment and result analysis, and finally is the conclusion.

## Model for batch steganography

Basic theoretic models of steganography are a noisy channel model<sup>[10]</sup> and the “Prisoners’ Problem” Simmons has been proposed. However, they do not propose a theoretic model on batch steganography or its basic

definitions. Shannon’s Second Theorem coding theory stated the constraints of noisy channel capacity, ratio of translation, and channel coding. Depending on Nyquist theory and Shannon’s theorem, Gaussian noisy channel states that the channel capacity of low signal-to-noise ratio (SNR) increases the noise of a system as it relates to channel capacity, bandwidth, and SNR. Ramkumar designed a steganographic channel model with noise based on this model. Simmons proposed a definition of a subliminal channel in narrow and wide senses, and further expressed a basic model of covert communication based on the subliminal channel. This scheme mainly uses fingerprints.

Previous research described steganography and steganalysis for single cover (digital media, e.g., image). This paper will present a theoretic model for batch steganography. In Fig.1, the model finish data has large hiding capacity, improves the security of the steganographic scheme, and increases the competence of fortification for corresponding steganalysis.

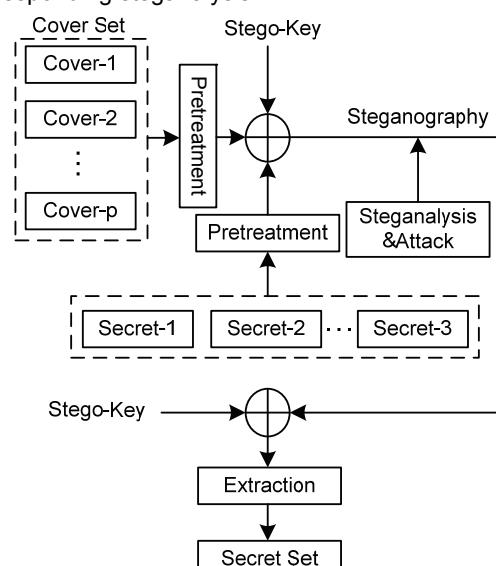


Fig.1. Batch Steganographic model

The model of batch steganography is composed of the following:

- (1) Sorter of covers set
- (2) Pretreatment of secret information
- (3) Splitting secret information
- (4) Embedding algorithm

(5) Extraction algorithm , and so on

Batch steganography generalizes the problem of hiding data  $M$  to  $N$  covers. The focus of this paper is embedding strategies, maximum payload, and the security of the stegosystem.

### Basic assumption and definitions

DEFINITION 1. Suppose:

(1)  $C$  is covers set:  $C=\{c_1, c_2, \dots, c_a\}$  and  $a$  is the number of covers. If  $C_1, C_2, \dots, C_N$  is the sequence set, write  $\{C_n\}$ ,  $n$  is a positive integer and  $n \leq N$  s.t.  $C_i=\{c_k | 0 < k \leq i\}$ .

(2)  $S$  is a set of secret information blocks:

$S=\{s_1, s_2, \dots, s_q\}$ , for the size of  $S$ , write  $|S|$  as:

$$|S|=\sum_1^q |s_j| . q \text{ is the number of secret information blocks.}$$

(3)  $C_b$  is the steganographic covers set that must satisfy:

$$C_b \subseteq \{C_n\}, |C_b| > |S| (0 < b \leq a)$$

write  $N = \overline{C_b}$  , which is the number of aiming steganographic covers.

(4)  $K$  is a set of all stego-keys  $K=\{k_1, k_2, \dots, k_v\}$ ,  $v$  is the number of stego-keys.

(5)  $C_S$  are covers with  $S$  and  $K$ .

(6)  $E_K$  is an embedding algorithm:  $C \times S \times K \rightarrow C_S$ .

(7)  $D_K$  is an extraction algorithm of secret information:

$$C_S \times K \rightarrow S. D_K(E_K(c_i, s_i, k))=s_i \text{ s.t. } \forall s_i \in S \mid 1 \leq i \leq q, c_i \in C \mid 1 \leq i \leq N.$$

Thus, the stegosystem that satisfies the steganographic condition of (1)-(7) is defined as batch stegosystem, written as:

$$(1) T_m=(C, S, K, C_S, E_K, D_K).$$

Then, the aforementioned definition such that: (1) The basis of sequence sets  $\{C_n\}$  is monotonic increasing, and chosen strategies from covers set  $C$  to  $C_b$  is a complex algorithm. (2)  $S$  is a set of secret information, as well as a large amount of secret information blocks. (3) Stego-key set  $K$  includes the scheme of private and public keys.(4) Embedding algorithm  $E_K$  and extraction algorithm  $D_K$  converse mutually. (5) Batch stegosystem  $T_m$  is a function of six groups.

DEFINITION 2. In batch stegosystem  $T_m$ , hiding information of batch covers  $C_b$  must satisfy condition  $R_m$ , such that: (1) Intangibility for cover set, (2) Security of stego-key set, (3) Robustness for  $T_m$ .

Therefore, maximum payload  $M$  of batch steganography is defined as:

$$|M|=\{m|m \in M, M|(R_m, \Gamma_m)\},$$

satisfying the following constraints:

(1) Cover set is  $C_b=\{c_1, c_2, \dots, c_p\}$ ,  $p$  is the number of covers.

$$C_b \subseteq \{C_n\} \text{ and } |C_b| > |S| (0 < b \leq a).$$

(2)  $C_b$  satisfies  $R_m$  of maximum payload  $M$  for the entire stegosystem.

(3)  $q$  is a secret blocks' number for the corresponding maximum payload  $M$ ,  $|M|=\sum_1^q |m_j|$ .

(4)  $\Delta f$  is the changed rate of  $C_S$  based on visible features, and satisfying  $\Delta f \leq JND$ . Just noticeable degree (JND) is a visible threshold.

Thus, the yielded relative model with regard to batch covers and corresponding maximum payload is:

$$(2) |M|=\max(g(C, E_K, D_K, R_1, R_2, R_3, R_4))$$

Therein:  $|M|$  is the maximum payload of batch covers  $C$ .  $R_1$  is the relative coefficient of corresponding covers.  $R_2$  is the relative coefficient in different embedding algorithm.  $R_3$  is the relative coefficient of secret information.  $R_4$  also is the

relative coefficient of stego-key.  $g$  is a mapping, and satisfies:

$$(3) (C, E_K, D_K) \times (R_1, R_2, R_3) \rightarrow |M|$$

Certain assumptions can prove<sup>11</sup> THEOREM 1 as follows from DEFINITION 1 and 2.

THEOREM 1.Satisfying under condition for batch stegosystem  $\Gamma_m$ :

(1)  $S$  is secret information set,  $C_b$  is covers set hiding information, satisfying:  $C_b \subseteq \{C_n\} (0 < b \leq N)$  and  $|C_b| > |S|$  .

(2) The relationship of  $c_1, c_2, \dots, c_i (0 \leq i \leq p)$  of  $C_a$  in accordance with the static Markov Chain.

(3)  $\forall i, j (0 \leq i, j \leq N, i \neq j)$ ,  $R(E_i, E_j)=0$ ,  $E_i$  and  $E_j$  denote embedding practices of secret information for  $c_i$  and  $c_j$  of covers, respectively.

(4)  $|M|=\sum_1^q |m_j|$ ,  $|M|$  is maximum payload of hiding aimed covers.

Therefore,

(1) If  $|M|/\sqrt{N} \rightarrow \infty$  as  $N \rightarrow \infty$  then for sufficiently large  $N$ ,  $\Gamma_m$  is at risk.

(2) If  $|M|/\sqrt{N} \rightarrow 0$  as  $N \rightarrow 0$  then for sufficiently large  $N$ ,  $\Gamma_m$  is safe.

Thus, the foregoing conclusion explains that the noisy channel theory does not apply estimation capacity and constraints of security. Relative to the steganography of a single cover, steganographic security is proportional to the dispersed degree of secret information. However, for batch steganography, under certain assumptions, its security is not linear with the dispersed degree of secret information, depending on the square root of number of covers. Namely, increasing the ratio of  $\sqrt{N}$  is much faster than increasing the ratio of  $|M|$ .

DEFINITION 3. Supposing batch stegosystem  $T_m$  satisfies:

(1) The steganographer knows hiding methods and has infinite calculating resources.

(2) The quantity of covers set  $C$  and aimed hiding covers set  $C_b$  are sufficiently large.

Then, this  $T_m$  is defined as perfect batch stegosystem (PBS).

If  $T_m$  does not satisfy foregoing constraints,  $T_m$  is defined as IBS.

DEFINITION 4. If  $T_m$  does not satisfy foregoing constraints,  $T_m$  is defined as IBS. Suppose:  $T_m$  is batch stegosystem,  $P_{C_b}$  is density function of  $C_b$  ,  $C_b = \{C_1, C_2, \dots, C_m\}$ ,  $m$  is the number of covers, and  $P_S$  is the density function of  $C_a$  carrying secret information. If  $D(P_{C_b} \| P_S) \leq \varepsilon$ , then  $\Gamma_m$  is called  $\varepsilon$ -secure. Moreover, when  $\varepsilon = 0$ ,  $T_m$  is perfectly secure.

### Imperfect batch steganography (IBS)

#### Capacity of IBS

Warden Willie's task is to determine the maximum payload for which risk of detection is acceptable by methods of pooled steganalysis for given  $N$  covers

$$C_S=\{C_S^1, C_S^2, \dots, C_S^N\} \quad C_S^i (0 < i \leq N)$$

treated by  $T_m$ , Willie's aim is to detect steganography, that is, to perform the hypothesis test:

$$H_0 : C_S^i = 0,$$

$$H_1 : C_S^i > 0, \text{otherwise}$$

$P=\{X \leq x | C_S^i > 0\}$  is the density function of  $T_m$ , and the element  $P_i$  of  $P=\{P_1, P_2, \dots, P_N\}$  corresponds with cover  $c_i$  and  $C_S^i$  carrying secret information. Suppose the quantity of  $C_S^i$

under  $H_0$  is  $A$ , the quantity of  $C_S^i$  under  $H_1$  is  $B$ . Thus, steganalysis based on  $H_0$  and  $H_1$  are two Bernoulli trials, steganalysis for  $T_m$  are also Bernoulli trials. Under DEFINITION 1, supposing: Covers set  $C_b = \{c_1, c_2, \dots, c_N\}$  ( $N$  is the number of covers),  $|c_i| = |c_j| (0 \leq i, j \leq N)$ , given:

$$|C_b| \sum_i^N P_i = |M|, |C_b| = N, |c_1| = N, |c_i|$$

Under  $H_1$ ,  $P = |s_i| / |C_S^i|$ .

If  $\gamma = p_i (0 < \gamma < 1)$ , the embedding probability is  $1-\gamma$  under  $H_0$ .

**THEOREM 2.** If  $T_m$  satisfies  $\varepsilon$  or  $\varepsilon^2$ -secure and certain assumptions, then the steganographic probability of an imperfect stegosystem is determined by the number of covers and the number of embedding covers.

Proof: Following previous assumptions of (1) and (2), given for  $T_m$ :

$$(4) \quad P = \{X \leq x \mid C_S^i > 0\} = \binom{N}{B} (\gamma)^B (1-\gamma)^{A-B}, A + B = N$$

$$(5) \quad P = \frac{N!}{(N-B)!B!} (\gamma)^B (1-\gamma)^{A-B} = \frac{N!}{(N-B)!B!} \left( \frac{|M|}{B|C|} \right)^B \left( 1 - \frac{|M|}{B|C|} \right)^{N-B}$$

Where  $\Gamma_m$  is not at risk, following  $\varepsilon$  or  $\varepsilon^2$ -secure of THEOREM 1. In the literature<sup>4</sup>, given :

$$|M| = \omega \sqrt{N} \quad (\omega \text{ is a constant})$$

$$(6) \quad P = \frac{N!}{(N-B)!B!} \left( \frac{\omega \sqrt{N}}{B|C|} \right)^B \left( 1 - \frac{\omega \sqrt{N}}{B|C|} \right)^{N-B}$$

Such that  $P = f(N, B, C)$  is a function of three groups with regard to  $N, B, C$ .

Deduction:

When fixing the number of covers and the number of steganographic aimed covers, maximum payload is determined for an imperfect stegosystem, satisfying Theorems 1 and 2.

The aforementioned deduction showed that the maximum payload of IBS determined by the number of embedding covers and the number of all covers, has nothing to do with the embedding algorithm. That is, embedding strategies and covers set determine the maximum payload of the system.

## Security of IBS

Suppose batch steganographic strategies are simply a separation equivalent, then  $p = |M|/(N|C_b|)$ ,  $p_i = p (0 < i \leq N)$ . Assuming:  $Q_1$  and  $Q_2$  are continuous random variables, and  $q_1$  and  $q_2$  are corresponding density functions. Then type-I error of steganalysis is  $\alpha$ , and type-II error of steganalysis is  $\beta$ . Following the definition of K-L divergence and  $\varepsilon$ -secure of Cachin, given

$$(7) \quad D_{KL}(Q_1||Q_2) = \int q_1(x) \frac{q_1(x)}{q_2(x)} dx$$

$$(8) \quad D_{KL}(\alpha, \beta) = \alpha \log_2 \frac{\alpha}{1-\beta} + \beta \log_2 \frac{\beta}{1-\alpha} \quad (\alpha + \beta < 1).$$

The determined process does not increase K-L divergence of the two kinds of distribution<sup>16</sup>. If  $g: Q \rightarrow T$  then  $D_{KL}(T_1||T_2) \leq D_{KL}(Q_1||Q_2)$ .

Not only is the hypothesis test on  $H_0$  and  $H_1$  Bernoulli trials for  $\alpha$  and  $1-\beta$ , but also a uniform distribution of probability  $p$  is based on covers hiding the information.

Suppose:

$$f_1 = \inf(\alpha_1, \alpha_2, \dots, \alpha_N) \text{ and } f_2 = \sup(\beta_1, \beta_2, \dots, \beta_N),$$

$f_1$  and  $f_2$  are the corresponding distributed functions of  $F_1$  and  $F_2$ :

$$(9) \quad D_{KL}(F_1||F_2) = N \int f_1(x) \log_2 \frac{f_1(x)}{f_2(x)} dx$$

$$\begin{aligned} &= N \int f_1(x) \log_2 \frac{f_1(x)}{f_1(x-p)} dx \\ &= N \int f_1(x) (\log_2 f_1(x) - \log_2 f_1(x-p)) dx \\ &= N \int f_1(x) \left[ p \frac{f_1'(x)}{f_1(x)} - \frac{p^2}{2} f_1''(\xi) \right] dx \\ &= N p \int f_1'(x) dx - N \frac{p^2}{2} f_1''(\xi) \int f_1(x) dx \\ &= -\frac{p^2 N}{2} f_1''(\xi) = -\frac{|M|^2}{N|C|^2} f_1''(\xi) \end{aligned}$$

$$\text{Such that } D_{KL}(F_1||F_2) = -\frac{|M|^2}{N|C|^2} f_1''(\xi) \leq C^1 \frac{|M|^2}{N|C|^2}.$$

Suppose  $C^1 \geq -\frac{f_1''(\xi)}{2}$ , ( $x-p < \xi < x$ ). Following THEOREM 1, given: Where  $\sqrt{M}/N \rightarrow 0$ ,  $\lim_{N \rightarrow \infty} D_{KL}(F_1||F_2) \rightarrow 0$

Because  $D_{KL}(F_1||F_2) \geq 0$  (if  $F_1=F_2$ , equality exists) and  $D_{KL}(F_1||F_2)$  is a convex function. If  $N \rightarrow 0$  and  $\sqrt{M}/N \rightarrow 0$ , Then  $D_{KL}(F_1||F_2) = 0$

Stegosystem  $\Gamma_m$  is an imperfect stegosystem because of assumptions satisfying the statistical Markov Chain. Thus,  $\Gamma_m$  satisfies the  $\varepsilon$ -secure definition of Cachin.

## Experimental results

Stegosystem  $\Gamma_m$  satisfy the conclusions of Theorem 1 and 2 under certain assumptions. Three kinds of strategies were adopted in the experiment of Embedding hidden information:(1) Embedding hidden information in fixed-size;(2) Embedding the secret information is proportional to  $\sqrt{N}$  ( $N$  is the total number of pixels of covers);(3) Embedding the secret information in proportion to the total number  $N$  of pixels of covers(Images library from the NRCS web site), noncompressed images, and make a simple split into smaller equal blocks.

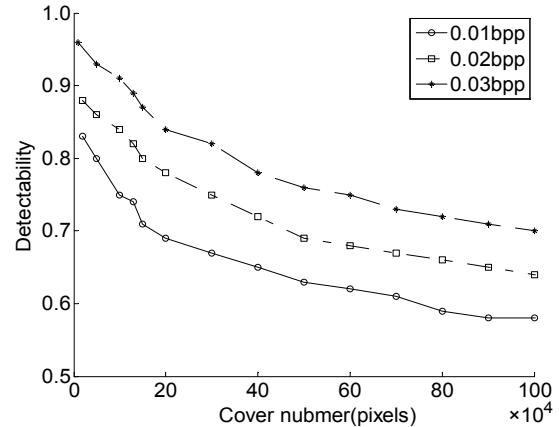


Fig.2. Relation of cover number and embedding capacity on fixed-size secure data

Fig2, Fig3 and Fig4 correspond to the experimental results of three embedding algorithm which are all used LSB method. In the experiment, maximum payload of batch steganography only strategy (2) exemplifies the case of regularity, the other consistent with the general analysis. Fig3 shows the curve illustrates the conclusion<sup>8</sup> must satisfy assumptions 1-4 in THEOREM 1.

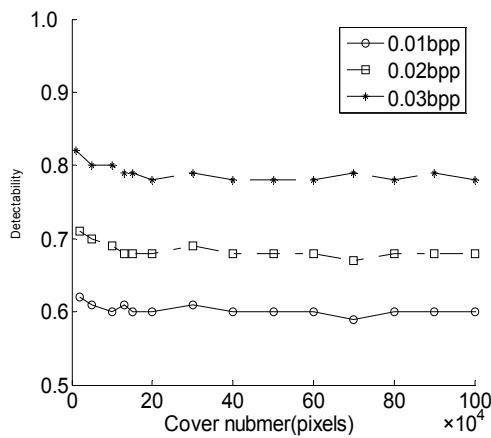


Fig.3. Embedding secure data on theorem1

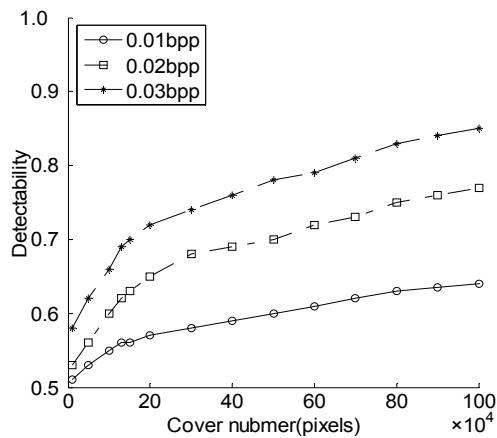


Fig.4.Embedding secure data proportional to cover number

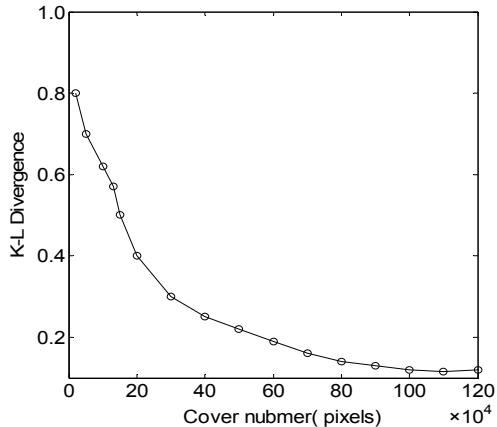


Fig.5. Security of imperfect batch stegosystem

Security of IBS in Fig5 can be verified. Satisfying certain assumptions, with the increase in the number of covers, when  $N \rightarrow \infty$  and  $\sqrt{M}/N \rightarrow 0$ ,  $D_{KL}$  gradually reduced which reflects the security of steganographic systems analysis and forma proof of the experimental consistency, and also shows batch stegosystem security constraints exist legitimacy.

## Conclusions

This paper proposed a batch steganographic theoretic model, and defined batch stegosystem and maximum payload for limitations of single steganography. It proved that batch steganographic capacity is different from noisy channel capacity theory. Under hypothesis test and certain assumptions, it obtained two kinds of relationships. One is batch steganographic strategies and capacity, and the other is K-L divergence. It proved that IBS is safe under certain constraints. Assumptions in the study were strict, thus, further research should study batch steganography under relaxed conditions.

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**Authors:** Asst.Prof. Ph.d.Gouxi Chen, North University of China , School of Electronics and Computer, 030051, Taiyuan, China, E-mail: chengouxicgx@163.com; M.A.Meng Zhang, North University of China , School of Electronics and Computer, 030051, Taiyuan, China, E-mail: zhanlangx0@gmail.com. Prof.Junjie Chen, Taiyuan University of Technology,E-mail:chenjunjie@tyut.edu.cn. Ph.d. Donglai Fu,E-mail: fudonglai@nuc.edu.cn;M.A.Yuliang E-mail:wuyuliang@163.com