

Prioritized Luby Transform (LT) codes

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- Introduction
- Background
- Prioritized LT Encoding Scheme
- Analysis and Results
- Conclusion and Future work

Luby Transform (LT) codes

- Luby invented rateless codes (fountain codes), where code rate (k/n) approaches to zero

- It is very efficient for correcting erasures with very small overheads as k increases

- Related work

- Tornado Codes(2001)
- Raptor Codes (2003)
- Unequal error protection of LT codes has been considered in [5] (2007)

- Current work

- Prioritized LT coding scheme extends the work from [5] and provide a systematic approach to enhance the likelihood of receiving high priority data while maintaining good overall decoding performance

- k : information bits
- n : encoded bits
- $r = n - k$: overhead
- p_1, p_2, \dots, p_k : discrete probabilities describing the degrees so that $\sum_{i=1}^k p_i = 1$

Each encoded bit is generated as follows:

- 1) Select a degree (random variable), d , according to the degree distribution $\{p_1, p_2, \dots, p_k\}$
- 2) Choose a d -element subset uniformly from $\{1, 2, \dots, k\}$
- 3) XOR the information bits in positions specified by 2)

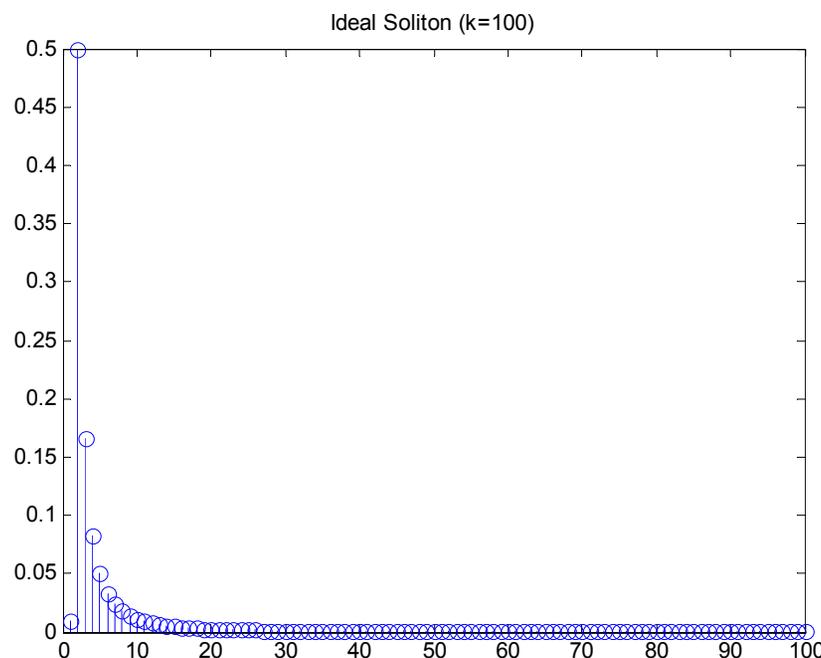
Probability Distribution of degrees
(Ideal Soliton Distribution)

$$\{\rho(1), \rho(2), \dots, \rho(k)\}$$

$$\rho(1) = \frac{1}{k}$$

$$\rho(i) = \frac{1}{i \cdot (i-1)} = \frac{1}{i-1} - \frac{1}{i} \text{ for } i = 2, 3, \dots, k$$

$$E[d] = \sum_{i=1}^k i \cdot \rho(i) = \sum_{j=1}^k \frac{1}{j} = H_k$$



Let's define new probability distribution
for degrees

$$\{\mu(1), \mu(2), \dots, \mu(k)\}$$

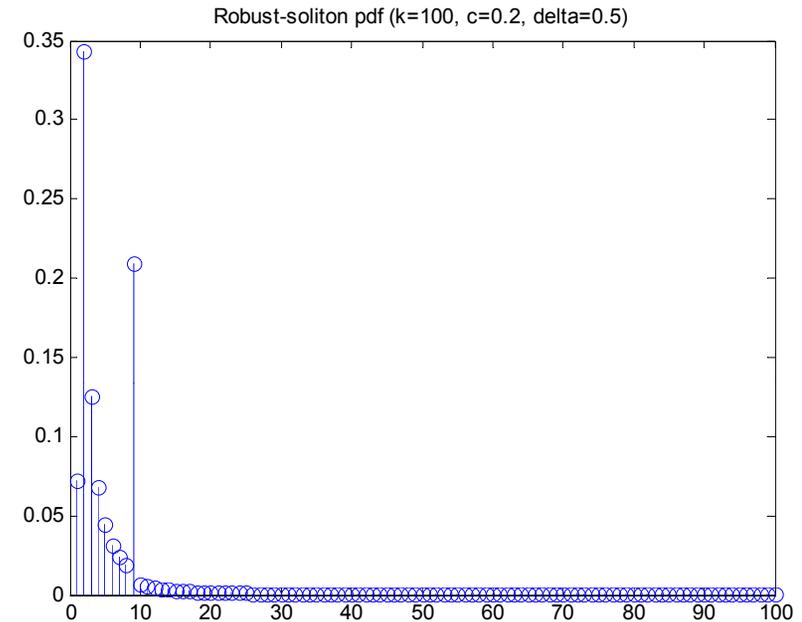
$$\mu(i) = \frac{\rho(i) + \tau(i)}{\beta} \quad \text{for } i = 1, 2, \dots, k,$$

where

$$\beta = \sum_{i=1}^k \{\rho(i) + \tau(i)\},$$

$$\tau(i) = \begin{cases} (c \ln(k/\delta)\sqrt{k})/(ik), & \text{for } i = 1, \dots, \{k/(c \ln(k/\delta)\sqrt{k})\} - 1 \\ \{(c \ln(k/\delta)\sqrt{k}) \ln(c \ln(k/\delta)\sqrt{k})/\delta\}/(ik), & i = \{k/(c \ln(k/\delta)\sqrt{k})\} \\ 0, & i = \{k/(c \ln(k/\delta)\sqrt{k})\} + 1, \dots, k \end{cases}$$

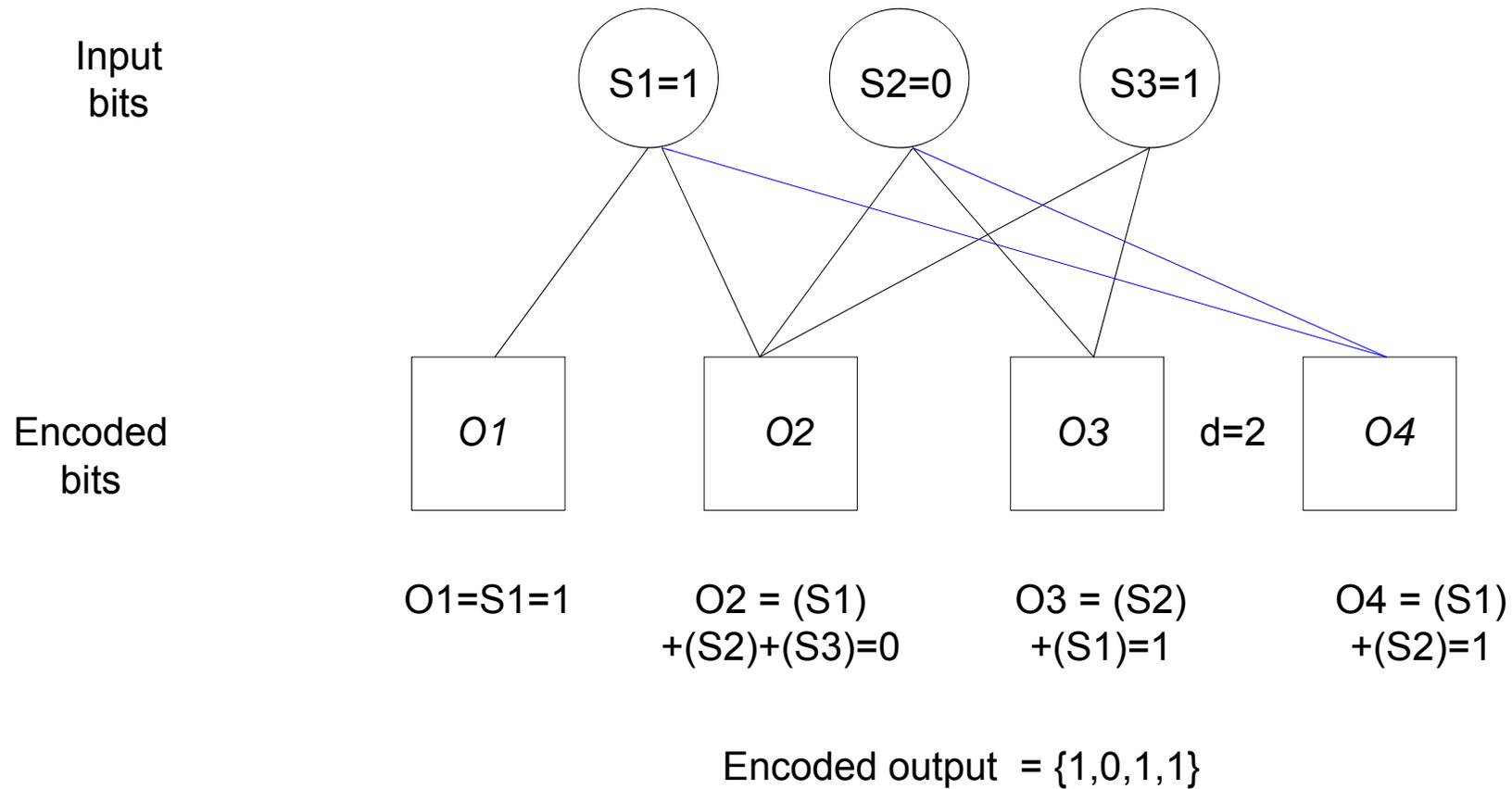
- $\mu(1)$ does not vanish as much as $\rho(1)$ as k increases
- Also, increased probability of having higher degrees adds efficiency of decoding



Encoding LT codes



LT Encoding: $k = 3, n = 4$



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Goal : In communications, some of data are more important than other. If decoder fails, we want to decode high priority data with high reliability. LT codes is designed to maximize the overall decoding performance

Prioritized LT codes:

- Without losing the fidelity of overall decoding performance, we want to maximize the data return of certain portion of data.
- Redesign the “uniform bit selection” part to increase the likelihood receiving certain portion of data (science/command)
- Modify encoder only

Let's define the following parameters:

- h : the number of high priority bits
- $t = h/k$: fraction of high priority bits over total information bits
- p_1, p_2, \dots, p_k : discrete probabilities using the *Robust-Soliton* distribution
- q_1, q_2, \dots, q_h : discrete probabilities describing the degrees so that using the *Robust-Soliton* distribution

$$\sum_{i=1}^k p_i = 1$$

$$\sum_{i=1}^h q_i = 1 \quad \text{for high priority bits}$$

Algorithm



Initialize $count = 1$

For $i \in \{1, 2, \dots, n\}$,

1) Select a random degree d according to the *Robust-Soliton* degree distribution, $\{p_1, p_2, \dots, p_k\}$

if $d = 1$,

choose d uniformly from high priority data group $\{1, 2, \dots, h\}$

else if $d = 2$,

If $count \leq \Omega$

choose d uniformly from high priority data group $\{1, 2, \dots, h\}$ and
 $count = count + 1$

else

choose d uniformly from entire set of information bits $\{1, 2, \dots, k\}$

else if $d \geq 3$

choose d uniformly from entire set of information bits $\{1, 2, \dots, k\}$

2) XOR information bits obtained from 1) to generate

x_i

Intuition:

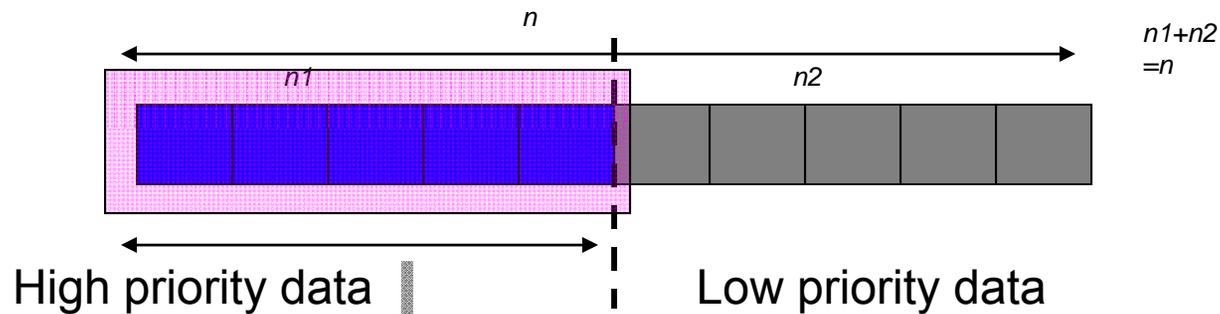
-Assign lower degrees (degree 1 or 2) to high priority data so that decoding process can start from high priority group

(Constraints on the selections of degree 1 or degree 2 encoded bits)

Illustration of Systematic degree calculation



Key Idea: Mix of regularity (high priority data) and non-regularity (low priority data) at the encoder



The number of degree 2 encoded bits impacts decoding performance significantly

Calculate degree distribution for high priority block (n_1)

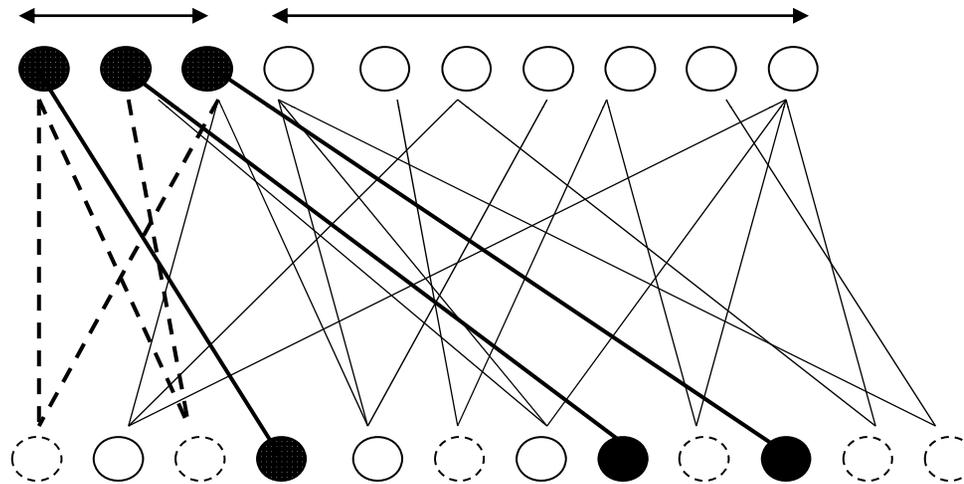
To maintain good high priority data decoding performance

Calculate degree distribution for whole block (n)

To maintain good overall packet decoding performance

Enforce decoding high priority data first, by introducing non-uniformity while maintaining good full packet decoding performance

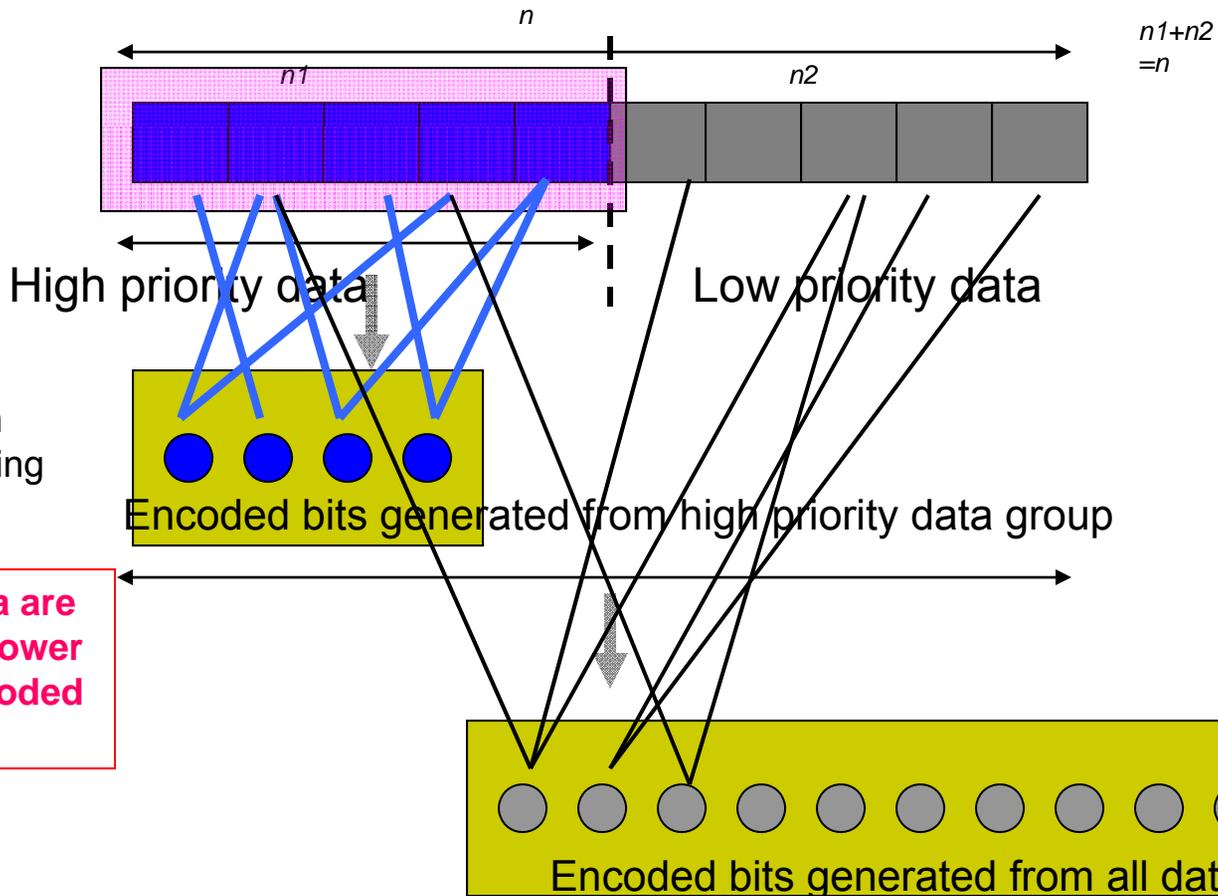
$$k = 10, n = 12, h = 3, \Omega = 2$$



Encoder Structure



Degree: 2, 1, 2, 2, 3, 2, 2, ..

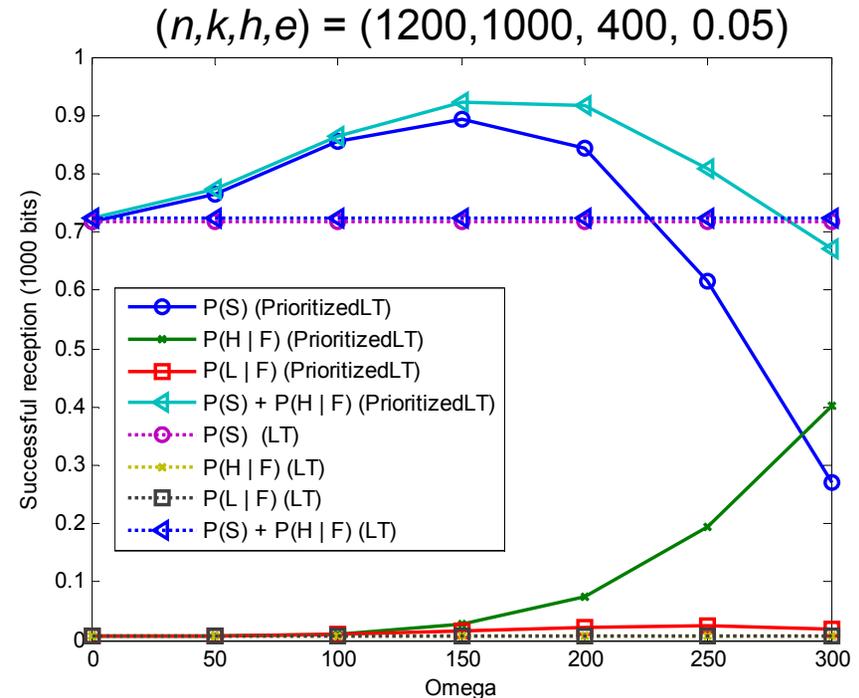
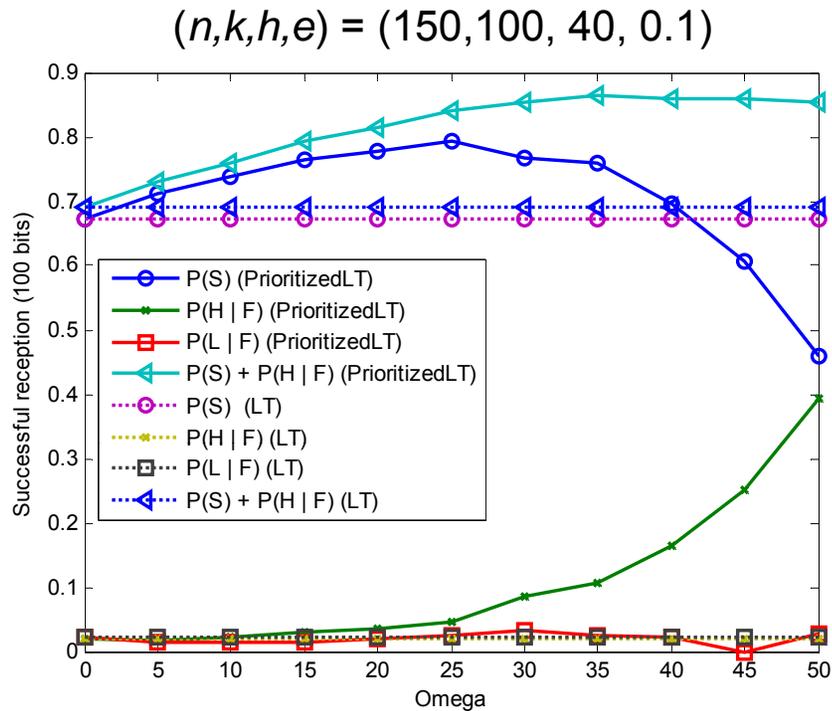


Maintain good high priority data decoding performance

High priority data are clustered at the lower degrees and decoded faster

Maintain good overall packet decoding performance

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$$\Omega \sim h/2 = k/4$$

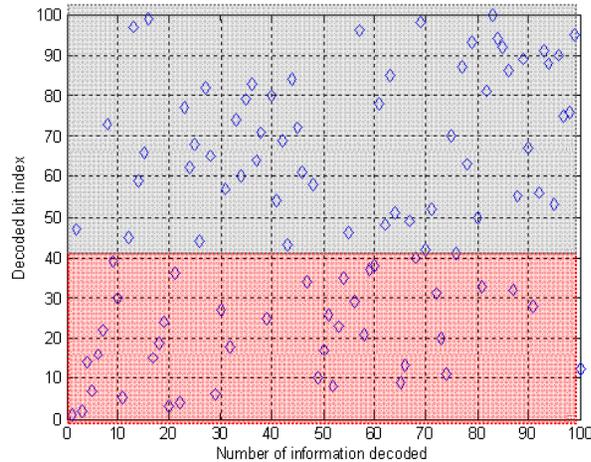
- $P(\text{successful decoding of all data}) = P(S)$
- $P(\text{decoding failure}) = 1 - P(S) = P(F)$
- $P(\text{successful decoding of high priority data}) = P(S) + P(\text{successful decoding of more than 90 percent of high priority data} \mid \text{decoding failures}) = P(S) + P(H|F)$
- $P(\text{successful decoding of low priority data}) = P(S) + P(\text{successful decoding of more than 90 percent of low priority data} \mid \text{decoding failures}) = P(S) + P(L|F)$

Successful Decoding Process

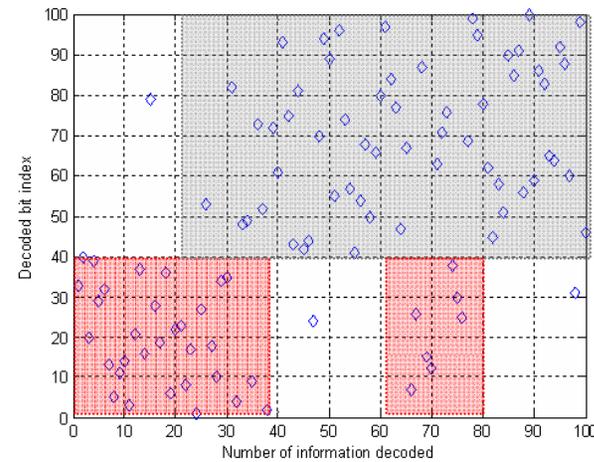


$$(n,k,h,e) = (150,100,40,0.01)$$

LT

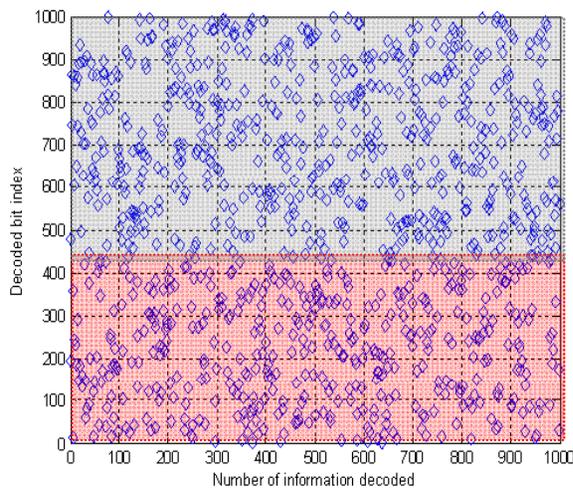


Prioritized
LT

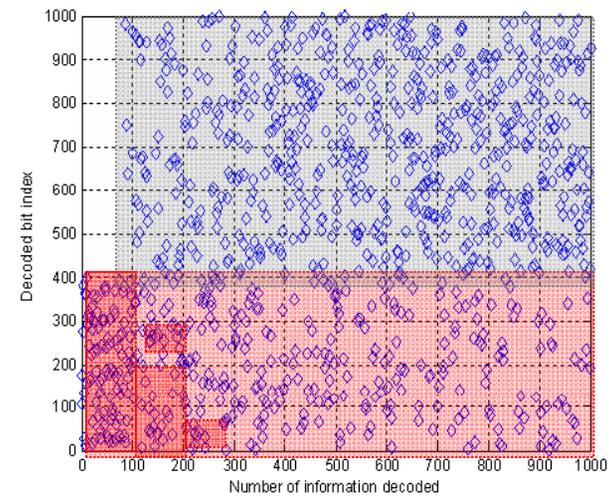


$$(n,k,h,e) = (1200,1000,400,0.01)$$

LT



Prioritized
LT

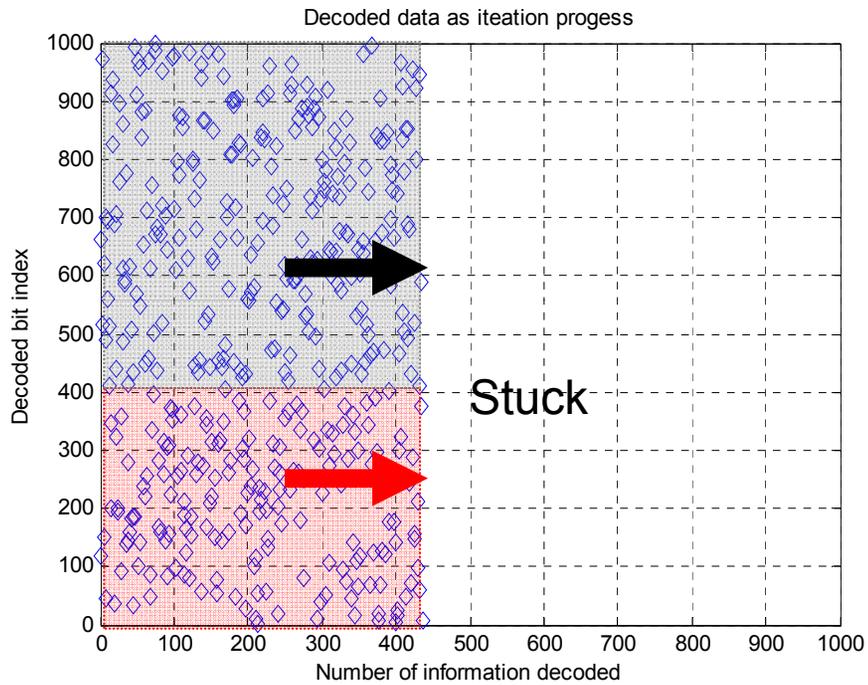


Decoding Failure

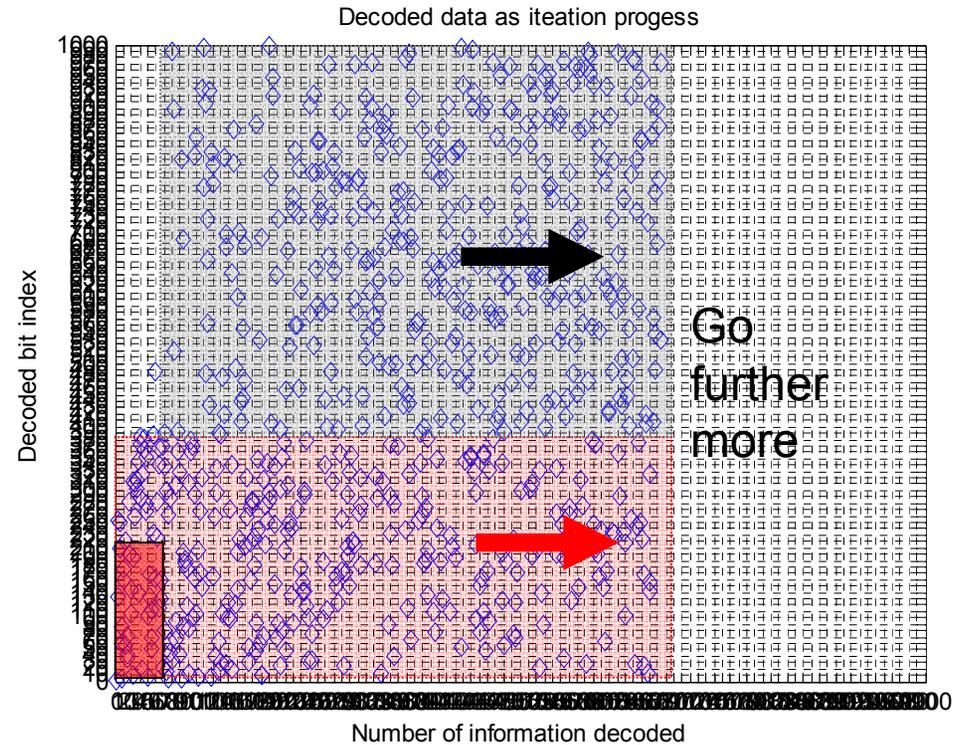


$$(n,k,h) = (1100,1000,400)$$

LT

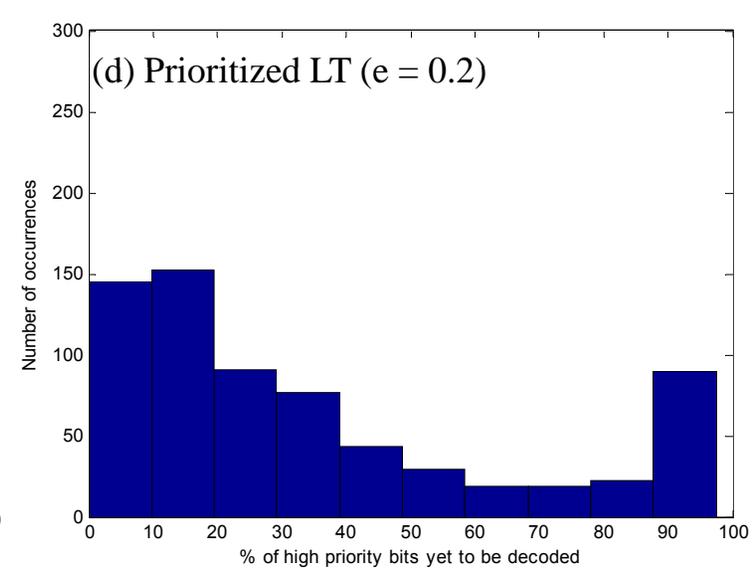
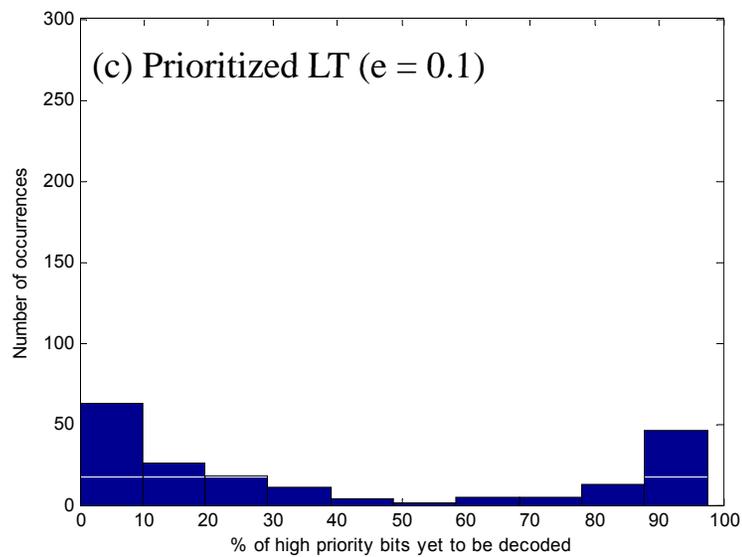
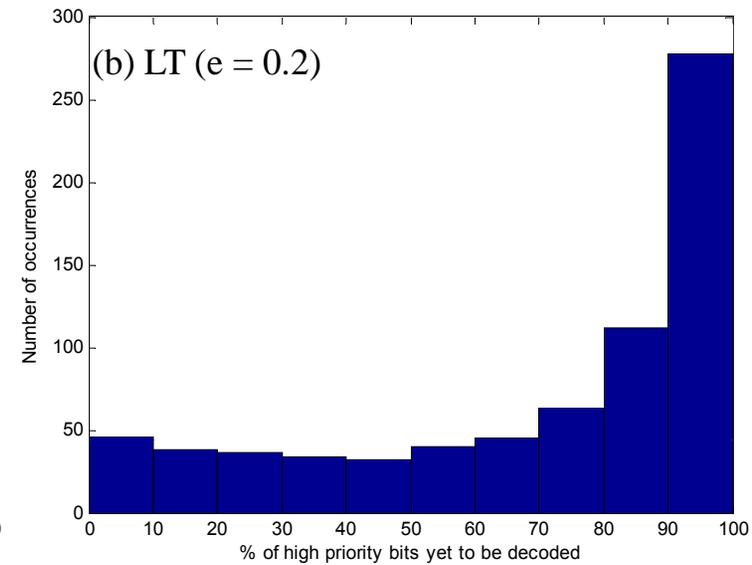
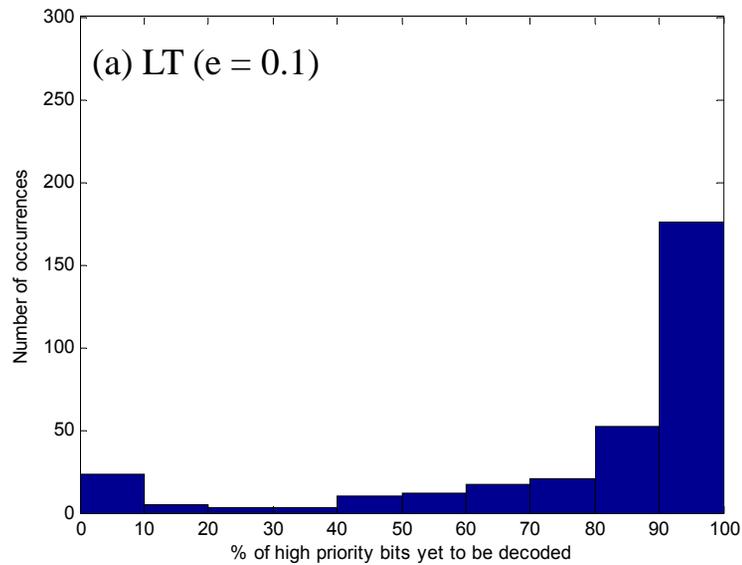


Prioritized LT



This means decoding more data

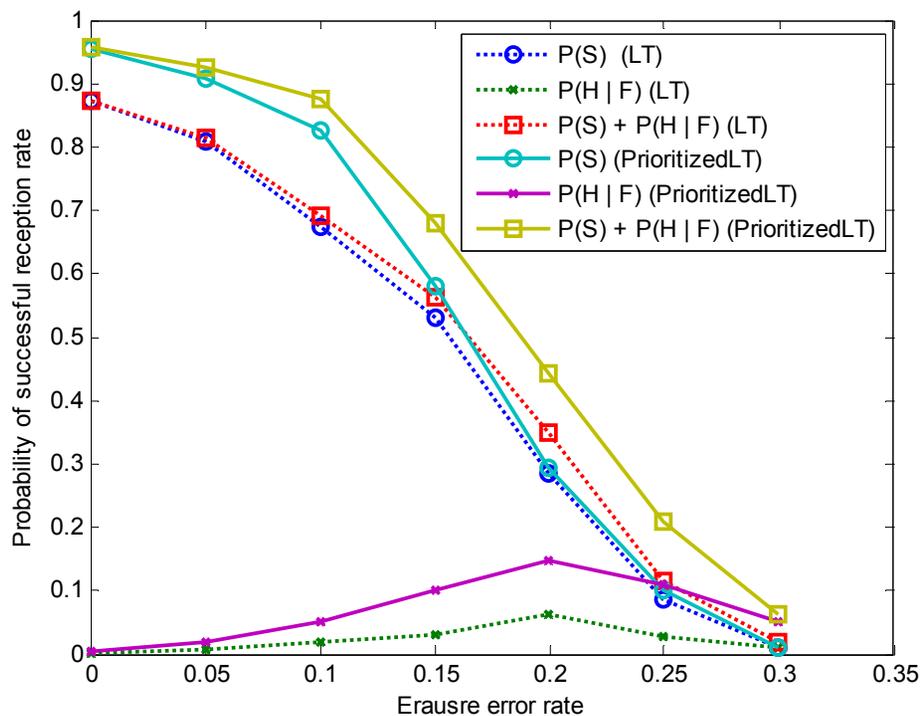
Failure distributions



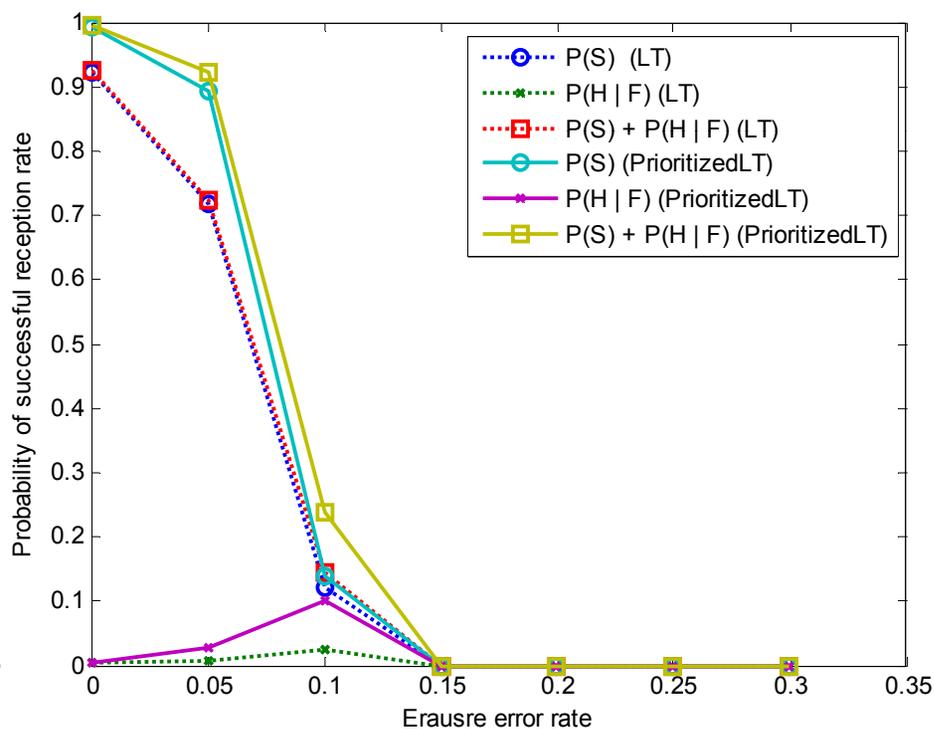
Overall decoding performance



$(n,k,h)=(150,100,40)$



$(n,k,h)=(1200,1000,400)$



- ❑ We obtained the experimental result using the sub-optimal algorithm to increase the likelihood of decoding high priority data (and it performs better than the original LT codes)
- ❑ Prioritized LT codes scales well up to high priority data size less than the 50% of total information bits
- ❑ This scheme requires modifications on LT encoder
- ❑ Potential benefits include sending video, audio, or any data types with high priority data
- ❑ LT codes can be combined with ARQ scheme and will be effective for channel with high bandwidths and long propagation delay (due to minimal feedback)
- ❑ This scheme works well for finite block LT codes but questionable for rateless approach
- ❑ Applying AWGN channel and used with other channel codes
- ❑ Rateless approach

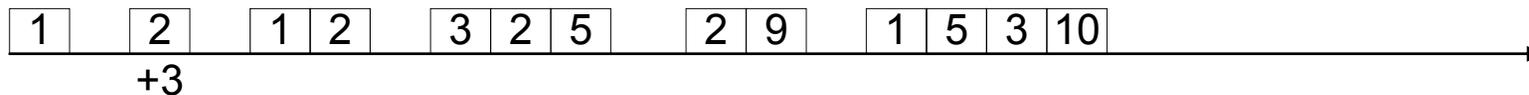
- [1] Michael G. Luby, Michael Mitzenmacher, M. Amin Shokrollahi, and Daniel A. Spielman, "Efficient Erasure Correcting Codes," *IEEE Transactions on Information Theory*, VOL. 47, NO. 2, FEBRUARY 2001
- [2] Amin Shokrollahi, "Raptor Codes," *IEEE Transactions on Information Theory*, vol. 52, pp. 2551-2567, 2006.
- [3] R. M. Karp, M. Luby and A. Shokrollahi, "Finite-Length Analysis of LT codes," in *Proc. IEEE Int. Symp. Information Theory*, Chicago, IL, Jun./Jul. 2004, pp. 39.
- [4] E. Maneva, and A. Shokrollahi, "New Model for Rigorous Analysis of LT codes," in *Proc. IEEE Int. Symp. on Information Theory (ISIT)*, Seattle, WA, Jul. 2006, pp. 2677-2679.
- [5] N. Rahnavard, B. N. Vellambi, and F. Fekri, "Rateless Codes with Unequal Error Protection Property," in *Proc. IEEE Trans. on Information Theory*, vol. 53, no4, pp.1521-1532, Apr. 2007

Coupon Collectors Problem II

Different way of formulating problem

There are k different types of coupons one wants to collect and how many (XOR) bits need to be send to collect all coupons

(Hint: We do not throw away the same information)



Expected number of bits need to be send are drastically reduced by sending linear combinations !