## English Text over Erasure Channel

## 10\% erasures:

A_ she said_this she I_oked down at her han_s, _nd was surpris_d to _ee _hat she had put on one of th_ Rabbit's _ittle white _id_gloves wh_le she was talking._'How CAN I have done that?'_she_th__ght. '_ m_st be growing small again.' She got up and _ent to the table to measure hersel_ by it,_a_d_fo_nd that,_as n_arly as she could gu__ , __e was now

## 20\% erasures:

a_out _wo fe__ high,_an_ _as_go__g _n__h__nking rapid__: she _oon found out that t_e _ause of this was the fa_ she_wa_ holding, _nd__he dropp_d it has_ily,_just i_ t__e to_avoid shrinking away altog_ther.
'That__AS a narrow es_ape!' said ___ce,_a good deal _righ__ned at _h_ s_dde_ change,_but very glad_to _in_ __rsel_ s_ill_in existence; '_nd

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$30 \%$ erasures:
n__ __r th__gard_n!'__nd _he_r__ wit___ll _p_e_ __c__to _he_li_tl_ door:
_u_, _I_! the litt_e doo_ w_s__hut __ain, a__ t_e_li__l_ g_lde_ key was lying on t_e _l_ss_t_ble__s be_ore, 'and _hing_ are wor_e th_n _v_r,' t_ought_t_ po_r child, 'f_r_I neve_ __s _o ___llas th__ be_o_e, _e_e_! And I_dec_are $\qquad$ t bad,_tha $\qquad$ t is!'

40\% erasures:
_s __e_s $\qquad$ t_es__w_rds h $\qquad$ _oot_sli_ped, and_in_ano_her $\qquad$ ent, $\qquad$ as_! she wa_up $\qquad$ _e_ c_in in _alt water. _e_ first _d_a _as t_at s__ had $\qquad$ eh $\qquad$ fal_e_int__t $\qquad$ a, _'_nd i_ th $\qquad$ ase_l_can go_ba_k_by r_il_ay,'_h he s s_i i_ to to_h $\qquad$ . (Alice had $\qquad$ _e e_to to_the se_ $\qquad$ d $\qquad$ nc__in __r_li__, an_h__ c_me_t_ th_ gener_ $\qquad$ cl $\qquad$ , __a $\qquad$ her __e e__ou $\qquad$

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50\% erasures:
$\qquad$ on t $\qquad$ Eng_i__ __a $\qquad$ a $\qquad$ e $\qquad$ ba $\qquad$ ng ma_h_n_s in_th_ S $\qquad$ , s $\qquad$ h $\qquad$ n ig ig_i $\qquad$ in_the san $\qquad$ woode_s $\qquad$ h __ a_r_w of $\qquad$ gin $\qquad$ h $\qquad$ s,_an_behin_ the $\qquad$ a a _ailway st $\qquad$ o_.) H_we__r, _h_s $\qquad$ ma_e_ou_ tha_ $\qquad$ e_w_s__n n_h h__O $\qquad$ f _e $\qquad$ w_i $\qquad$ _ she_h_d w_p_ w__n $\qquad$ __s n $\qquad$ e $\qquad$ h $\qquad$ h.

60\% erasures:
$\qquad$ w_sh_l_h $\qquad$ $r$ $\qquad$ S m $\qquad$ !' _a_d $\qquad$ c_, as_s $\qquad$ s_am_a_out, $\qquad$
$\qquad$ fi__h h $\qquad$ t. $\qquad$ h_l $\qquad$ s_ed_fo_ _t $\qquad$ w, $\qquad$ u_po __, $\qquad$
b $\qquad$ g _r_w_ed $\qquad$
$\qquad$ r_! h $\qquad$ _I_L $\qquad$ q $\qquad$ hi $\qquad$ u_e!

Ho_e_e_, _v_ry $\qquad$ g is _u_e $\qquad$ o-__y.'
$\qquad$ th $\qquad$ h_ar $\qquad$ eth $\qquad$ g s h $\qquad$ bo $\qquad$ n $\qquad$ p $\qquad$ I _ _ 1 $I_{-}$

## Source-channel separation



- For (time-varying) DMC we can design the source encoder and channel coder separately and still get optimum performance
- Not true for:
- Correlated Channel and Source
- Multiple access with correlated sources
- Broadcast channel


Figure 1.5. A binary data sequence of length 10000 transmitted over a binary symmetric channel with noise level $f=0.1$. [Dilbert image Copyright(C1997 United Feature Syndicate, Inc., used with permission.]

| Received sequence $\mathbf{r}$ | Likelihood ratio $\frac{P(\mathbf{r} \mid s=1)}{P(\mathbf{r} \mid s=0)}$ | Decoded sequence $\hat{\mathbf{s}}$ |
| :---: | :---: | :---: |
| 000 | $\gamma^{-3}$ | 0 |
| 001 | $\gamma^{-1}$ | 0 |
| 010 | $\gamma^{-1}$ | 0 |
| 100 | $\gamma^{-1}$ | 0 |
| 101 | $\gamma^{1}$ | 1 |
| 110 | $\gamma^{1}$ | 1 |
| 011 | $\gamma^{1}$ | 1 |
| 111 | $\gamma^{3}$ | 1 |

Algorithm 1.9. Majority-vote decoding algorithm for $\mathrm{R}_{3}$. Also shown are the likelihood ratios (1.23), assuming the channel is a binary symmetric channel; $\gamma \equiv(1-f) / f$.

| S | 0 | 0 | 1 | 0 | 1 | 1 | 0 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| t | $\overbrace{000}^{0}$ | $\overbrace{000}^{0}$ | $\overbrace{111}^{1}$ | $\overbrace{000}^{0}$ | $\overbrace{111}$ | $\overbrace{111}$ | $\overbrace{000}^{0}$ |
| n | 000 | 001 | 000 | 000 | 101 | 000 | 000 |
| r | $\underbrace{000}$ | $\underbrace{001}$ | $\underbrace{111}$ | $\underbrace{000}$ | $\underbrace{010}$ | $\underbrace{111}$ | $\underbrace{000}$ |
| S | 0 | 0 | 1 | 0 | 0 | 1 | 0 |
| ors |  | $\star$ |  |  |  |  |  |
| ors |  |  |  |  | $\star$ |  |  |

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Figure 1.12. Error probability $p_{\mathrm{b}}$ versus rate for repetition codes over a binary symmetric channel with $f=0.1$. The right-hand figure shows $p_{\mathrm{b}}$ on a logarithmic scale. We would like the rate to be large and $p_{\mathrm{b}}$ to be small.

| s | t | s | t | s | t | S | t |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0000 | 0000000 | 0100 | 0100110 | 1000 | 1000101 | 1100 | 1100011 |
| 0001 | 0001011 | 0101 | 0101101 | 1001 | 1001110 | 1101 | 1101000 |
| 0010 | 0010111 | 0110 | 0110001 | 1010 | 1010010 | 1110 | 1110100 |
| 0011 | 0011100 | 0111 | 0111010 | 1011 | 1011001 | 1111 | 1111111 |

Table 1.14. The sixteen codewords $\{\mathbf{t}\}$ of the $(7,4)$ Hamming code. Any pair of codewords differ from each other in at least three bits.


Figure 1.17. Transmitting 10000 source bits over a binary symmetric channel with $f=10 \%$ using a $(7,4)$ Hamming code. The probability of decoded bit error is about $7 \%$.


Figure 1.18. Error probability $p_{\mathrm{b}}$ versus rate $R$ for repetition codes, the $(7,4)$ Hamming code and BCH codes with blocklengths up to 1023 over a binary symmetric channel with $f=0.1$. The righthand figure shows $p_{\mathrm{b}}$ on a logarithmic scale.

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$C \simeq 0.53$. Let us consider what this means in terms of noisy disk drives. The repetition code $\mathrm{R}_{3}$ could communicate over this channel with $p_{\mathrm{b}}=0.03$ at a rate $R=1 / 3$. Thus we know how to build a single gigabyte disk drive with $p_{\mathrm{b}}=0.03$ from three noisy gigabyte disk drives. We also know how to make a single gigabyte disk drive with $p_{\mathrm{b}} \simeq 10^{-15}$ from sixty noisy one-gigabyte drives (exercise 1.3, p.8). And now Shannon passes by, notices us juggling with disk drives and codes and says:

'What performance are you trying to achieve? $10^{-15}$ ? You don't need sixty disk drives - you can get that performance with just two disk drives (since $1 / 2$ is less than 0.53 ). And if you want $p_{\mathrm{b}}=10^{-18}$ or $10^{-24}$ or anything, you can get there with two disk drives too!'
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[Strictly, the above statements might not be quite right, since, as we shall see, Shannon proved his noisy-channel coding theorem by studying sequences of block codes with ever-increasing blocklengths, and the required blocklength might be bigger than a gigabyte (the size of our disk drive), in which case, Shannon might say 'well, you can't do it with those tiny disk drives, but if you had two noisy terabyte drives, you could make a single high-quality terabyte drive from them'.]

