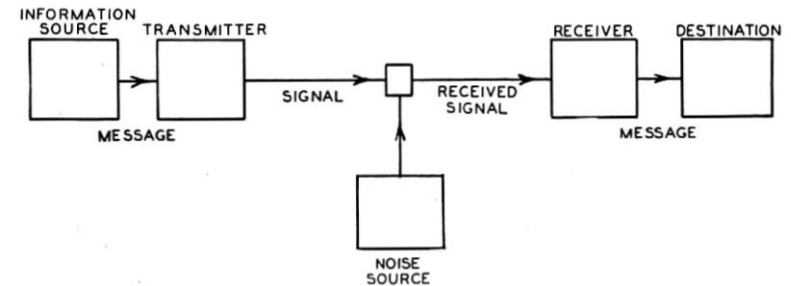
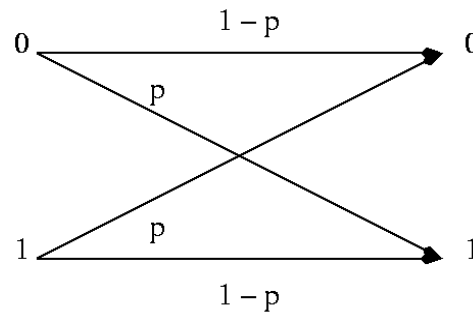
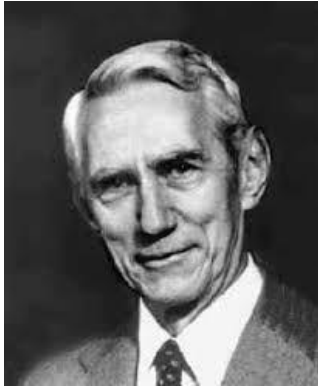


Creativity in Communications Theory – Claude Shannon¹

“The fundamental problem of communication is that of reproducing at one point either exactly or approximately a message selected [sent] at another point.”



(April 30, 1916 – February 24, 2001) **Binary Symmetric Channel (BSC)**

To Obtain Reliable Transmission of BSC Data: Add redundancy to the data.

- Combine $\underline{d} = (d_0, d_1, \dots, d_{n-1})$ with check bits $\underline{c} = (c_0, c_1, \dots, c_{k-1})$.
- Transmitted message: coding $\underline{d} \rightarrow \underline{x} = (\underline{d}, \underline{c})$; Received message: $\underline{y} = \underline{x} + \text{error}$
- Decoded message: $\underline{y} \rightarrow \underline{x}^* \rightarrow \underline{d}^*$
- Recover the original data $\underline{d}^* = \underline{d}$ with probability $> 1 - \epsilon$.

¹Claude Shannon “A Mathematical Theory of Communication”, *Bell System Technical Journal*, (27)3, July 1948, pp. 379-423.

Repetition Code²

- Transmit odd number of copies $2j+1$ of each of the n data bits.
- Majority decision decoding ($0 \leq p < 1/2$)

Mini-Shannon BSC Coding Theorem: For every data bit length n and $\varepsilon > 0$, there exists j (a repetition factor) such that the MAP probability of error is bounded above by ε .

- Number of check bits $k = 2jn$.
- Code word $\underline{x} = (2j+1)$ copies of \underline{d} .
- Transmission rate $R = \frac{1}{2j+1} \rightarrow 0$ as $n \uparrow, \varepsilon \downarrow$
- Decoding Rule: MAP (maximize *a posteriori* probability)
Maximum Likelihood Estimation (Bayes Theorem).

²“If at first you don't succeed, try, try again. Then quit. There's no point in being a damn fool about it.”
W.C. Fields

Reliable and Efficient Transmission of BSC Data

Shannon's BSC Coding Theorem I: For every $\epsilon, \delta > 0$, there exists an integer $n^* = n^*(\epsilon, \delta, p)$ such that for data \underline{d} of bit length $n > n^*$, a coding scheme $\underline{d} \rightarrow \underline{x}$ into code words of length m exists for which *i*) MAP decoding achieves an error probability smaller than ϵ and *ii*) the coding rate $R = n/m$ satisfies $C - \delta \leq R < C$

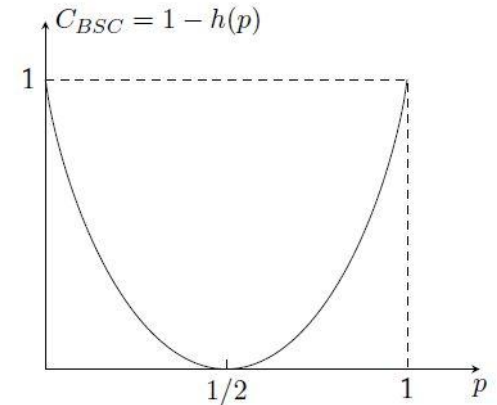
Weak Converse to Shannon's BSC Coding Theorem I: For any coding scheme, $\underline{d} \rightarrow \underline{x}$, which has a rate greater than the channel capacity C , the MAP error probability is bounded away from zero as the data lengths $n \rightarrow \infty$. In other words, the maximum achievable reliable transmission rate is C .

• Channel Capacity: $C_{BSC} = 1 - h(p)$

$$h(p) = -p \log_2 p - q \log_2 q; \quad 0 \leq p < 1/2; \quad q = 1-p$$

• Value of p : Signal power (S), Noise energy (N) and Bandwidth (B).

• Shannon-Hartley Law: $C = B \log_2 (1 + S/N)$



Binary Symmetric Channel Capacity

Achieving Shannon Coding Theorem by Algebraic Coding

Shannon's paper cites results from R. W. Hamming's paper on error-correcting and detecting codes.³

- Subset \mathbf{C} of $\mathcal{Z}_{m,2}$ $\underline{z}_1, \underline{z}_2 \in \mathcal{Z}_{m,2}$

\mathbf{C} is a (binary) *code* for the BSC consisting of m -bit vector code words.

- Hamming distance $d(\underline{z}_1, \underline{z}_2)$ (Bit difference between \underline{z}_1 and \underline{z}_2)

- $S_r[\underline{x}] = \{ \underline{z} \in \mathcal{Z}_{m,2} : d(\underline{z}, \underline{x}) \leq r, \underline{x} \in \mathbf{C} \}$ (r -Sphere about \underline{x})

Volume of $S_r[\underline{x}]$: $|| S_r[\underline{x}] || = C(m,0) + C(m,1) + \dots + C(m,r)$

- $2^m || S_r[\underline{x}] || \leq 2^{n+k}$ (Hamming Bound) \Rightarrow Rate of code is $n/(n+k)$.

- Hamming (7,4) Code: $n = 4, m = 7$ (Single error-correcting, double error-detecting)
- Hamming ($2^r - 1, 2^r - r - 1$) Code: $n = 2^r - r - 1, m = 2^r - 1$ ($r \geq 2$)

³R. W. Hamming, "Error Detecting and Error Correcting Codes, *Bell System Technical Journal*, (29)2, April 1950, pp. 147-160.

Algebraic Coding Literature

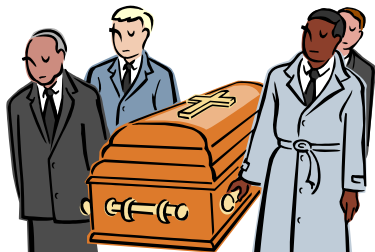
1. I. S. Reed, "A Class of Multiple Error Correcting codes and the Decoding Scheme," *IEEE Transactions on Information Theory*, **IT-4**, pp. 38–49, September 1954.

Google search (1/1/15) "block algebraic coding books" yields >7,000,000 hits.

2. W. W. Peterson, "Error-Correcting Codes," MIT Press, 1961.
3. W. W. Peterson and E. J. Weldon, Jr., "Error-Correcting Codes," MIT Press, 1972.
4. F. J. MacWilliams and N. J. A. Sloane, "The Theory of Error-Correcting Codes," Elsevier, 1977.

(Talk at IEEE Communications Society Meeting 1971, St. Petersburg, Florida)

R. W. Lucky⁴, "[Algebraic]Coding is Dead,"
IEEE Spectrum, pp. 243-246, 1991.



⁴Electrical Engineer at Bell Labs and Telcordia; specialist in communication theory.



Achieving the Shannon Coding Theorem Rate

A. Probabilistic Coding (Algebraic Block Codes Versus Probabilistic Coding)

P. Elias, "Coding for Noisy Channels," *IRE Convention Record*, pt. 4, pp. 37-46, March 1955.

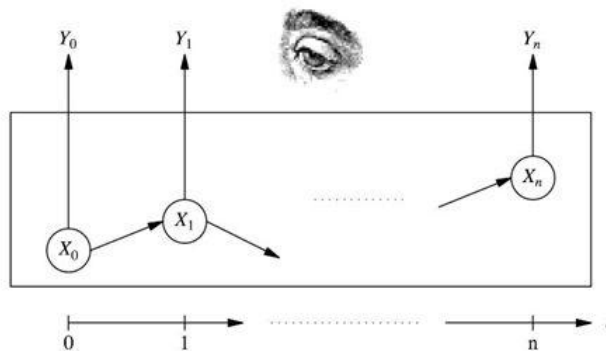
J. M. Wozencraft and B. Reiffen, "Sequential Decoding," MIT Press, 1961.

B. Soft Versus Hard Decoding (0/1 versus 000, 001, ..., 111)

C. Trellis Decoding Algorithm

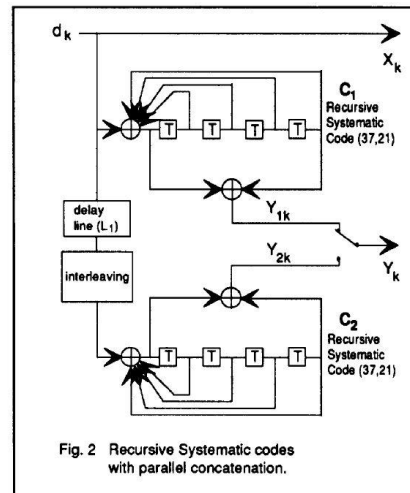
A. J. Viterbi, "Convolutional Codes and Their Performance in Communication Systems," *IEEE Transactions on Communications Technology*, COM-19(5), pp. 751-772, October 1971.

D. Decoding Using Hidden Markov Model (HMM)



Lalit Bahl, John Cocke, Fred Jelinek, and Joseph Raviv, "Optimum Decoding of Linear Codes for Minimizing Symbol Error Rate," *IEEE Transactions on Information Theory*, IT-20, pp. 284-287, March 1974

Berrou et al \Rightarrow Achieving Shannon Coding Theorem Limit⁵



What Claude Shannon Achieved!

He started the investigation of the relationship between the error and transmission rates in communication theory leading to today's technology!

⁵C. Berrou, A. Glavieux, and P. Thitimajshima, "Near Shannon limit Error-correcting Coding and Decoding: Turbo codes", *Proceedings 1993 International Conference on Communications*, Geneva, Switzerland, May 1993, pp. 1064–1070. (Ecole Nationale Supérieure des Télécommunications de Bretagne, France)

(Turbo Coding) U.S. Patent US5446747 A (Berrou), filed 1991.