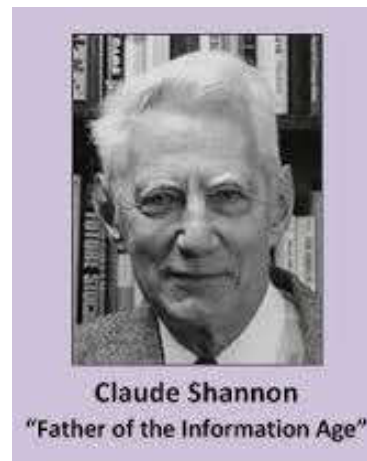


Shannon and my research

Where did I use the ideas of Claude Elwood Shannon?

At the occasion of his 100th birthday, 2016

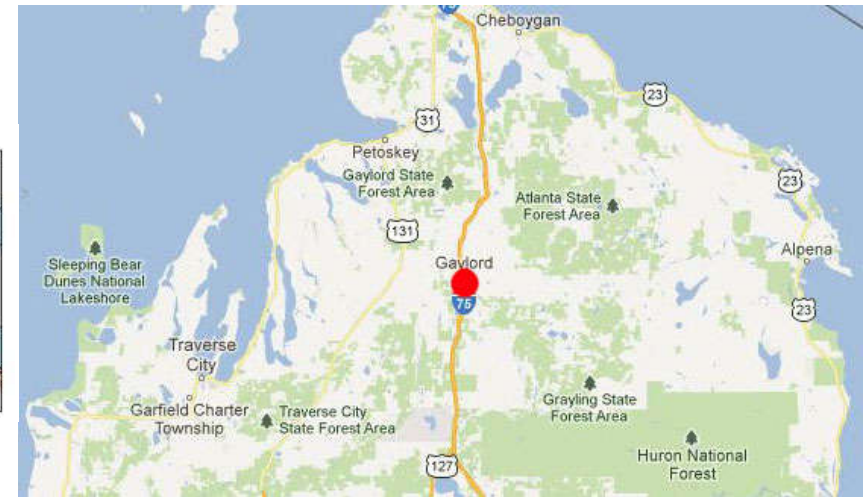
Han Vinck



A.J. Han Vinck, Johannesburg, June 2016



The historical perspective



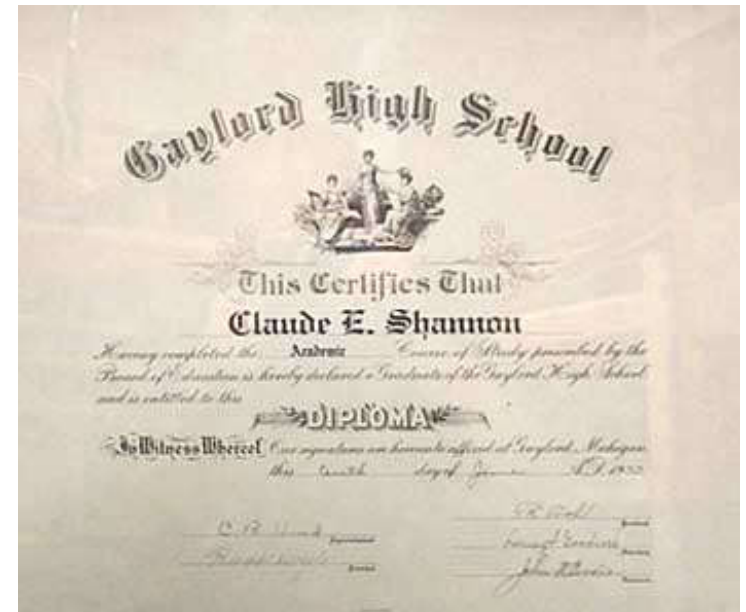
- Born 1916, Shannon was almost a Canadian (Vijay Bhargava)
- Master thesis: 1937 (age 21!) - *A Symbolic Analysis of Relay and Switching Circuits*,
- „Work“ for PhD: 1940 - *An Algebra for Theoretical Genetics*,
- Visit: 40/41 the Institute for Advanced Study, in Princeton
- Work at Bell labs: 1941 – 1958
 - 1948 published hij *A Mathematical Theory of Communication*
 - 1949 *Communication Theory of Secrecy Systems*
- „Work“ at MIT: 1959 - 1978



Claude Shannon Gaylord



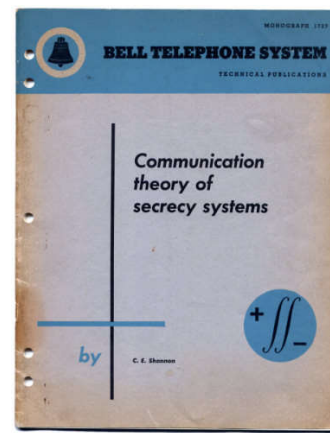
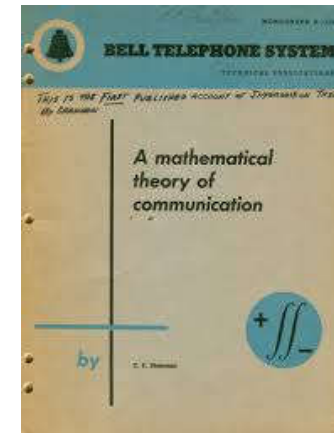
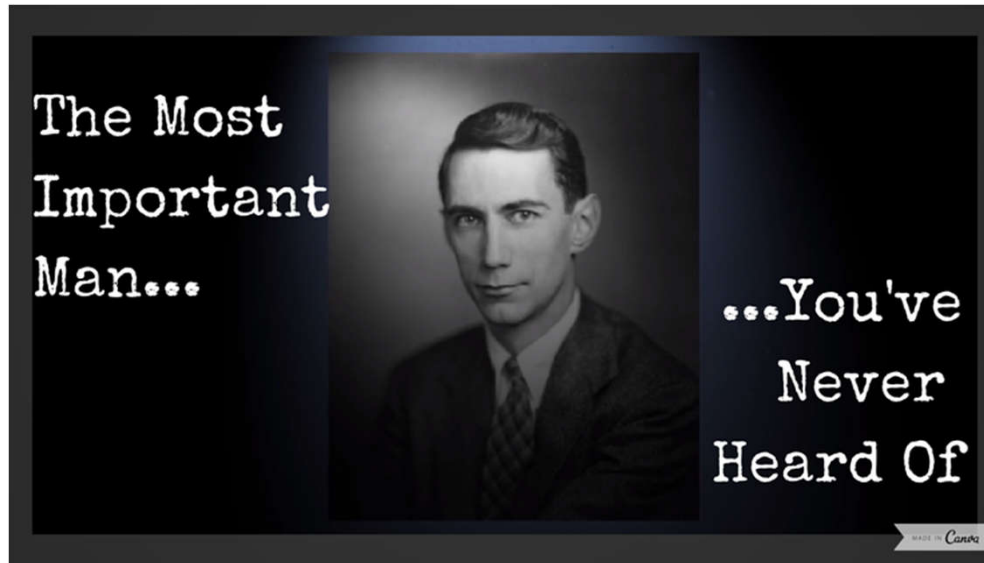
statue



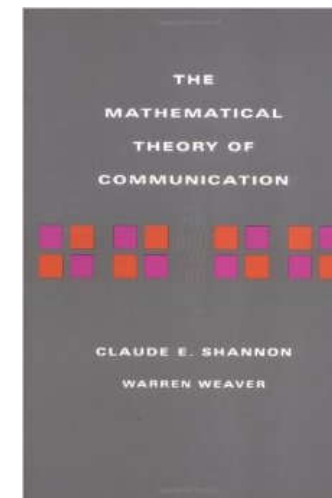
Later: flame-throwing trumpet.



Some pictures



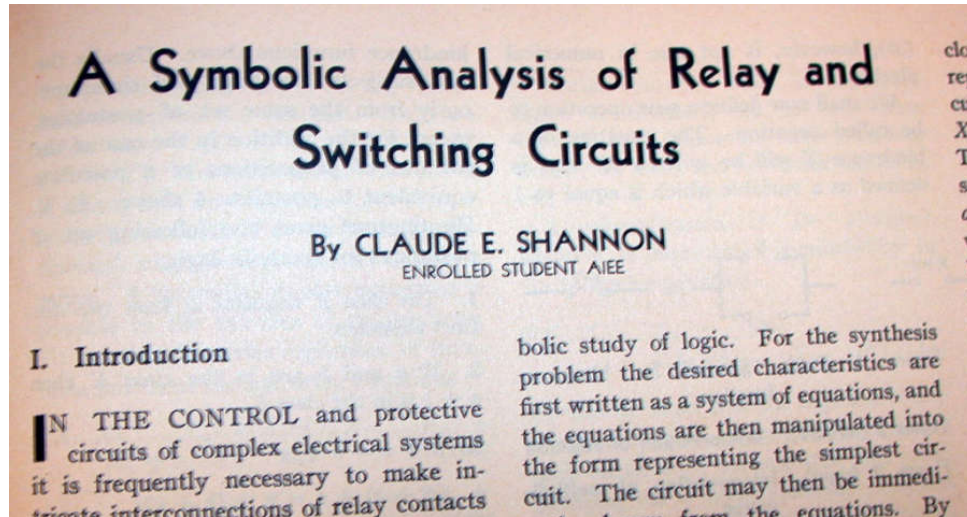
"transformed
cryptography from an art
to a science."



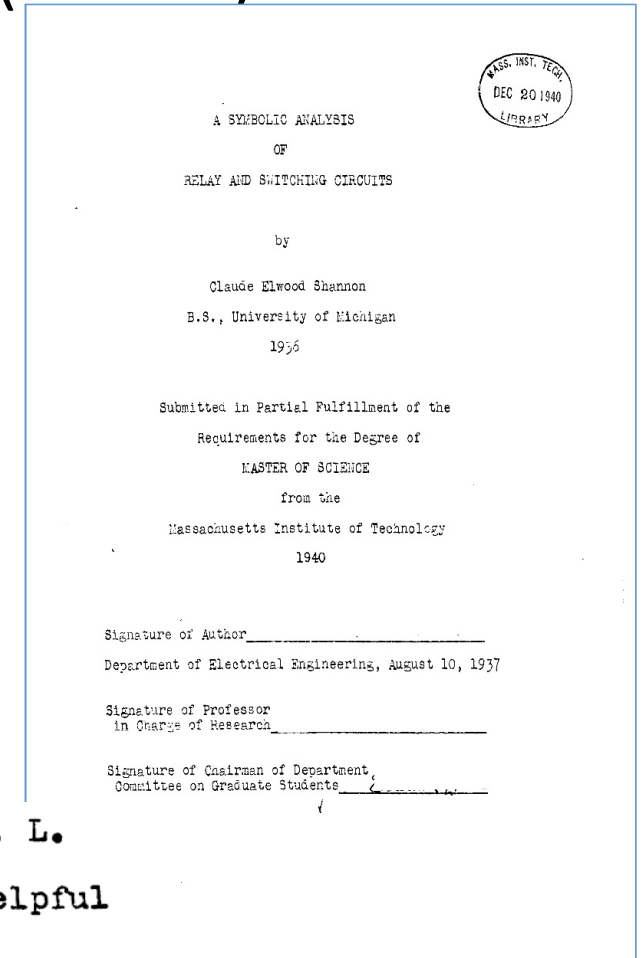
The book co-authored with [Warren Weaver](#), *The Mathematical Theory of Communication*, reprints Shannon's 1948 article and Weaver's popularization of it, which is accessible to the non-specialist.^[5] In short, Weaver reprinted Shannon's two-part paper, wrote a 28 page introduction for a 144 pages book and changed the title from "A mathematical theory..." to "The mathematical theory..."



It all started with a master thesis!(1936)



It's the diagrams used in the final chapter of the thesis, which showed different types of circuits, that contained the central circuit that is still used in digital computers. The circuit is the [4-bit full adder](#).

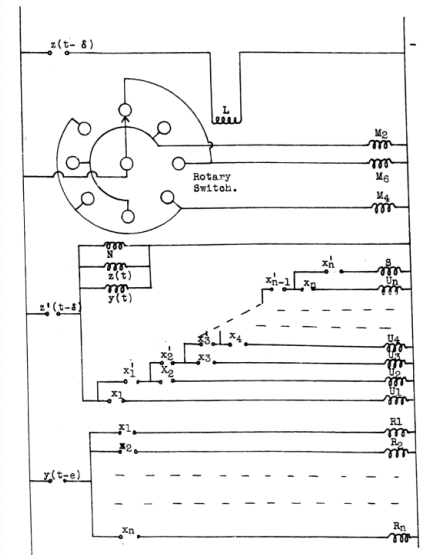


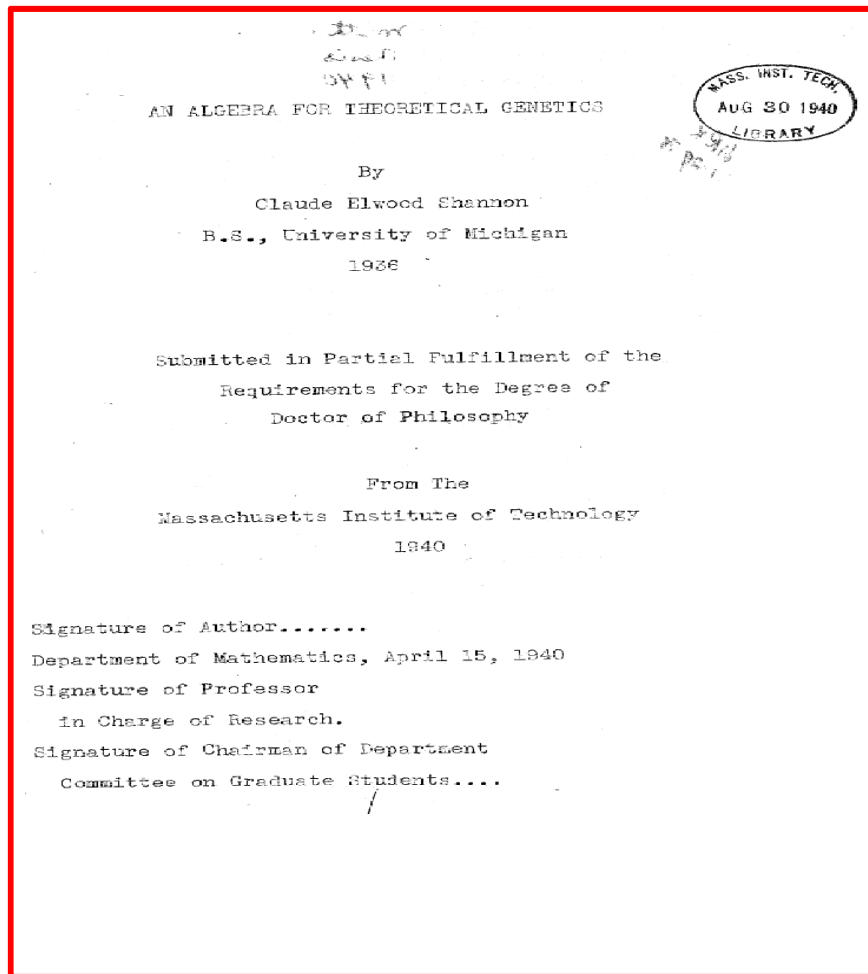
The author is indebted to Professor F. L. Hitchcock, who supervised the thesis, for helpful criticism and advice.



Master thesis described a machine to find prime numbers

As to the practicability of such a device, it might be said that J.P. Kulik spent 20 years in constructing a table of primes up to 100,000,000 and when finished it was found to contain so many errors that it was not worth publishing. The machine described here could probably be made to handle 5 numbers per second so that the table would require only about 2 months to construct.





Apparently, Shannon spent only a few months on the thesis.

With his creativity, if Shannon had stayed in population genetics, he would surely have made some important contributions. Nevertheless, I think it is fair to say that the world is far better off for his having concentrated on communication theory, where his work was revolutionary.

Because the thesis was unpublished, it had no impact on the genetics community.

Shannon also wrote a PhD thesis: who knows about it?



1956 RELIABLE CIRCUITS USING LESS RELIABLE RELAYS

BY

E. F. MOORE¹ AND C. E. SHANNON¹

Shannon Married (2) E(lizabeth) Moore



1130	Bode H W, Mathematics	MH-236
1910	Wiggins Miss M F, Secretary....	MH-201
1130	Darlington S	MH-978
	Blackman R B	MH-205
	Lakatos E	MH-437
	Ling D P	MH-234
	Zobel O J	MH-214
	Dietzold R L	MH-204
	Angell Miss D T	MH-202
	Hamming R W	MH-209
	McMillan B	MH-407
	Shannon C E	MH-209
	Schelkunoff S A	636
	Gray Miss M C	467
	MacColl L A	MH-215
	Shewhart W A	MH-239
	Harold Miss M S	MH-202
	Packer Miss M C	MH-427
	Tukey J W	MH-566
	Froelich Miss C L	MH-213
	Asbury Miss J G	MH-213
	Cooper Mrs H L	1464
	Moore Miss M E.....	{ 1972
		{ MH- 357
	Pecon Miss P A	MH-357
	Sumoska Miss H	1167
	Weiss Miss R A	MH-207
1140	MacNair W A, Military Research ..	MH-722
1910	Nimmo Miss P E, Secretary.....	MH-581
1140	Burger M J	MH-305
	Buntenbach R W	MH-219
	Clement G F	MH-219
	Kroop W A	MH-265
	Oestreicher J J	MH-792



Transmission problem

The fundamental problem of communication is that of reproducing at one point either exactly or approximately a message selected at another point. Frequently the messages have *meaning*; that is they refer to or are correlated according to some system with certain physical or conceptual entities. These semantic aspects of communication are irrelevant to the engineering problem. The significant aspect is that the actual message is one *selected from a set* of possible messages. The system must be designed to operate for each possible selection, not just the one which will actually be chosen since this is unknown at the time of design.

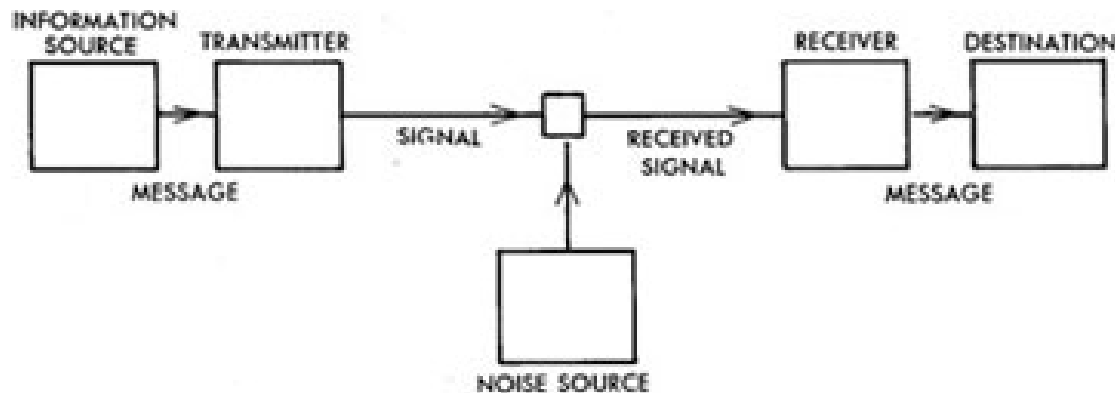
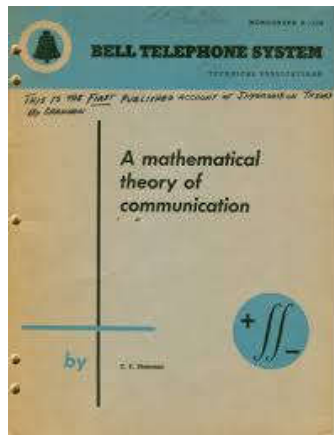


FIGURE 1



ENTROPY

- **Entropy** := minimum

We shall call $H =$

- Shannon 1948

- **Source coding**: mi

Example: p_1, p_2, p_3

Applications: Intern

Use "entropy" and you can never
lose a debate, von Neumann told
Shannon - because no one really
knows what "entropy" is.

William Poundstone

of a source

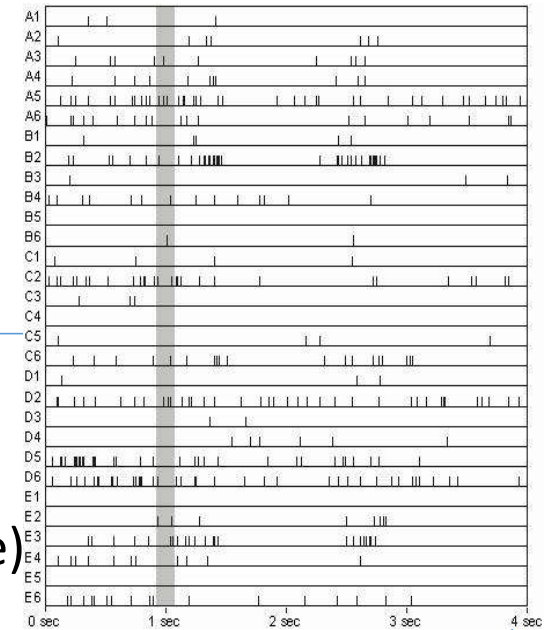
probabilities p_1, \dots, p_n .

o Coding)

resentation length $H = 3/2$



Problem entropy estimation



- How to estimate the entropy for:
 - Limited number of samples (spike trains in neuro science)

$$\hat{H}_{\text{plugin}}(n) = - \sum_{m=1}^M \frac{n_m}{n} \ln \left(\frac{n_m}{n} \right), \quad \mathbb{E} \left\{ - \frac{n_m}{n} \ln \left(\frac{n_m}{n} \right) \right\} \leq - \mathbb{E} \left\{ \frac{n_m}{n} \right\} \ln \left(\mathbb{E} \left\{ \frac{n_m}{n} \right\} \right)$$

- Sources with unknown memory

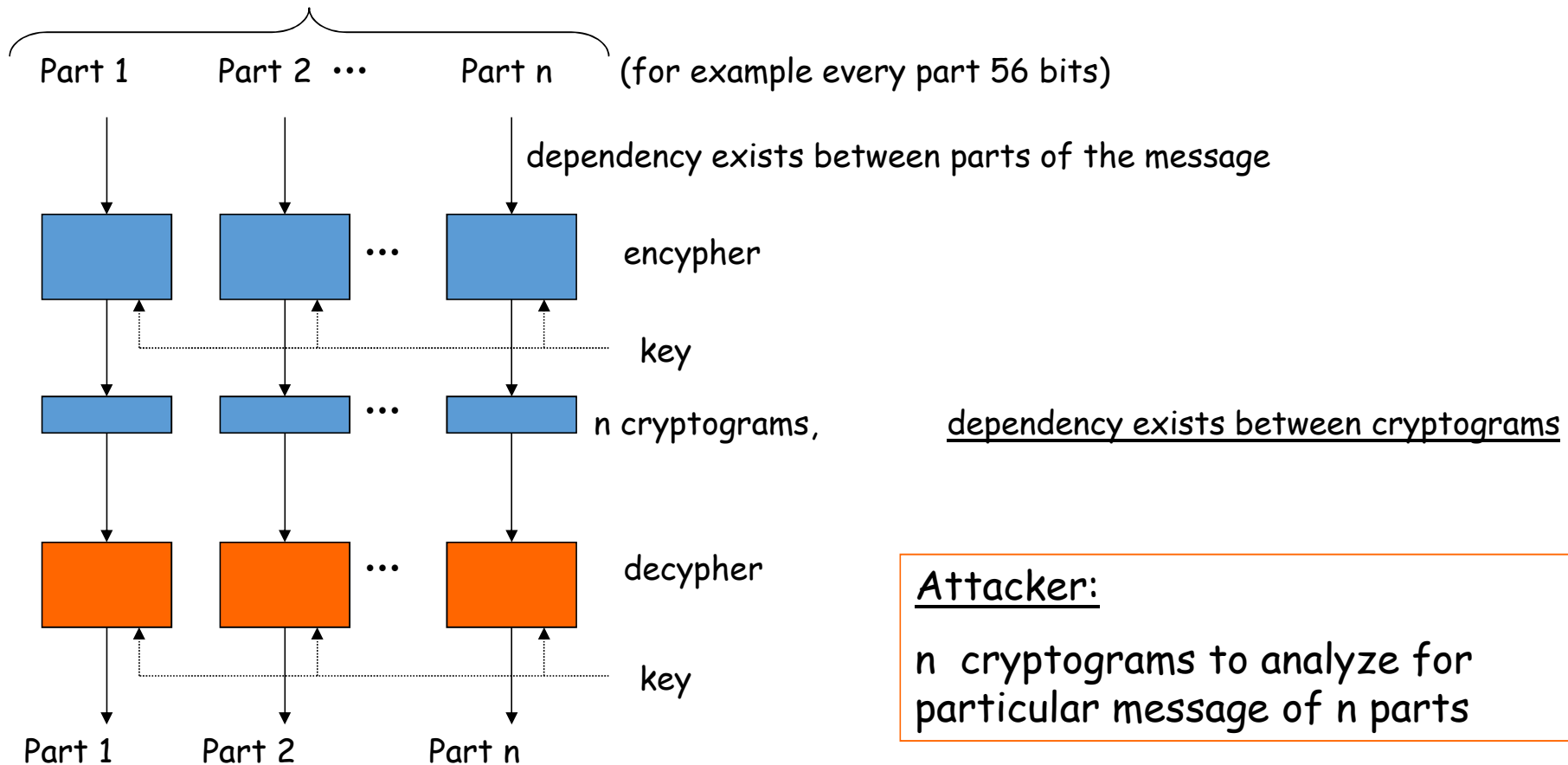
$$H_n = - \frac{1}{n} \sum_{i, j, \dots, s} p(i, j, \dots, s) \log_2 p(i, j, \dots, s) \quad (42)$$

$$H = \lim_{n \rightarrow \infty} H_n.$$

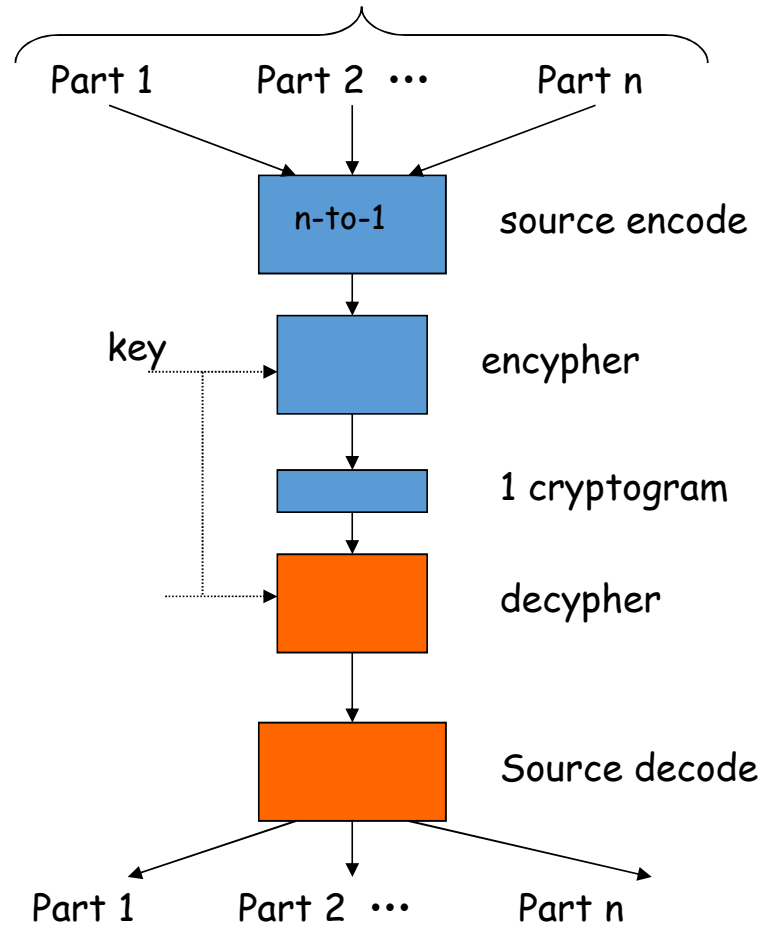
[Estimation of the entropy based on its polynomial representation](#), Phys. Rev. E 85, 051139 (2012) [9 pages], Martin Vinck, Francesco P. Battaglia, Vladimir B. Balakirsky, A. J. Han Vinck, and Cyriel M. A. Pennartz



Message encryption without source coding



Message encryption with source coding



(for example every part 56 bits)

Attacker:

- 1 cryptogram to analyze for particular message of n parts
- assume data compression factor n -to-1

Hence, less material for the same message!



Channel capacity: = maximum reduction in representation length with $P_e \leq \epsilon$!

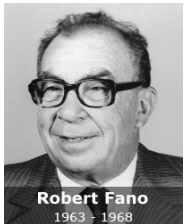
Information: = **Entropy** before transmission $H(X)$ – **Entropy** after transmission $H_y(X)$

The capacity C of a noisy channel has been defined as

$$C = \text{Max}(H(x) - H_y(x)) = H(Y) - H_x(Y)$$

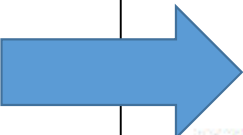
where x is the input and y the output. The maximization is over all sources which might be used as input to the channel.

$I(X;Y)$, Fano



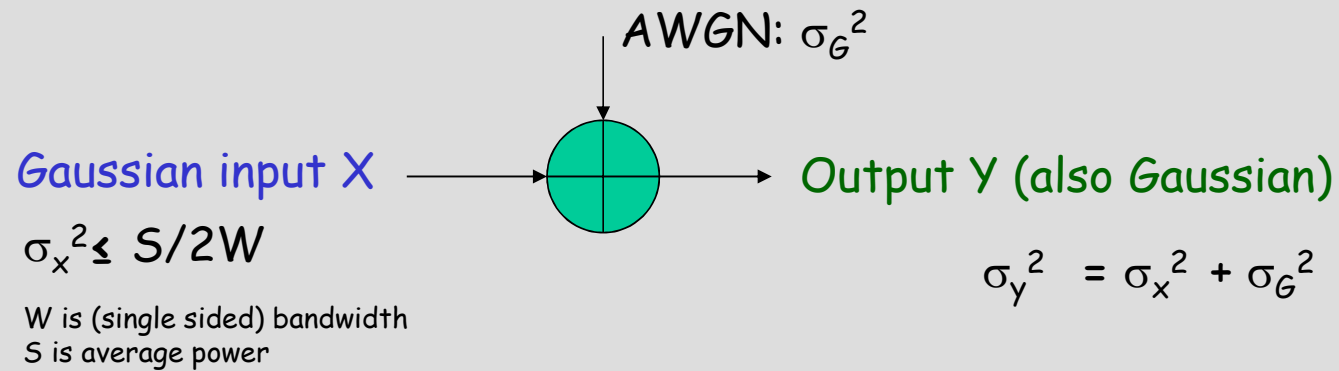
Theorem 17: The capacity of a channel of band W perturbed by white thermal noise power N when the average transmitter power is limited to P is given by

$$C = W \log_2 \frac{P+N}{N} = H(Y) - H_x(Y)$$

 This means that by sufficiently involved encoding systems we can transmit binary digits at the rate $W \log_2 \frac{P+N}{N}$ bits per second, with arbitrarily small frequency of errors. It is not possible to transmit at a higher rate by any encoding system without a definite positive frequency of errors.



Capacity for AWGN



$$\text{Capacity} = W \log_2 \left(1 + \frac{\sigma_X^2}{\sigma_G^2} \right) \text{ bits/sec.} \leq W \log_2 \left(1 + \frac{S/2W}{\sigma_G^2} \right)$$

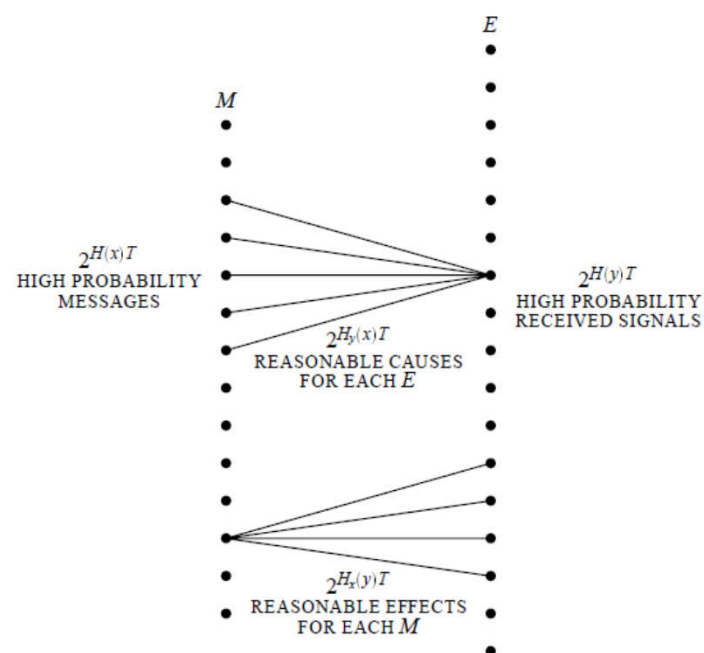


Claude
Shannon

A.J. Han Vinck, Johannesburg, June 2016



Capacity achieving Codes exist (Shannon, 1948)



. 10—Schematic representation of the relations between inputs and outputs in a channel.

Sketch of proof:Encoding: use a **random** codeDecoding:

1. look for a „closest“ code word ($P_{\text{ERROR}} \Rightarrow 0$, law of large numbers)
2. Probability that another codeword is in the decoding region $\Rightarrow 0$ (random code word selection)

The first rigorous proof for the discrete case is due to [Amiel Feinstein](#) in 1954.

Mathematicians did not like this (engineering) approach!



Capacity powerlimited channel (PLC channel)

Theorem 20: The channel capacity C for a band W perturbed by white thermal noise of power N is bounded by

$$C \geq W \log \frac{2}{\pi e^3} \frac{S}{N},$$

where S is the peak allowed transmitter power. For sufficiently large $\frac{S}{N}$

$$C \leq W \log \frac{\frac{2}{\pi e} S + N}{N} (1 + \epsilon)$$

Example CENELEC)

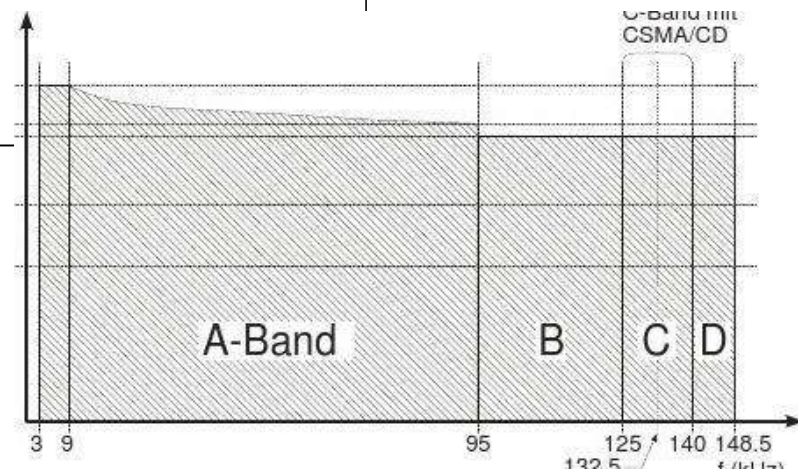


Figure 1: Maximum output level in the frequency range 3 kHz to 148.5 kHz in dB (μV)



Capacity over Gaussian inputs?

Channel Coding with Multilevel/Phase Signals

GOTTFRIED UNGERBOECK, MEMBER, IEEE

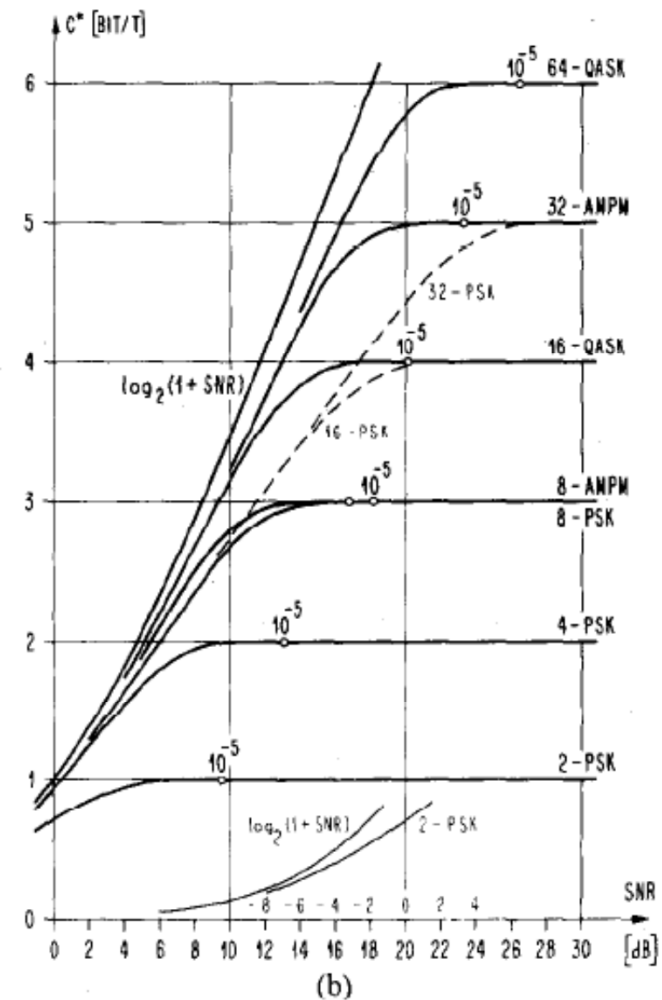


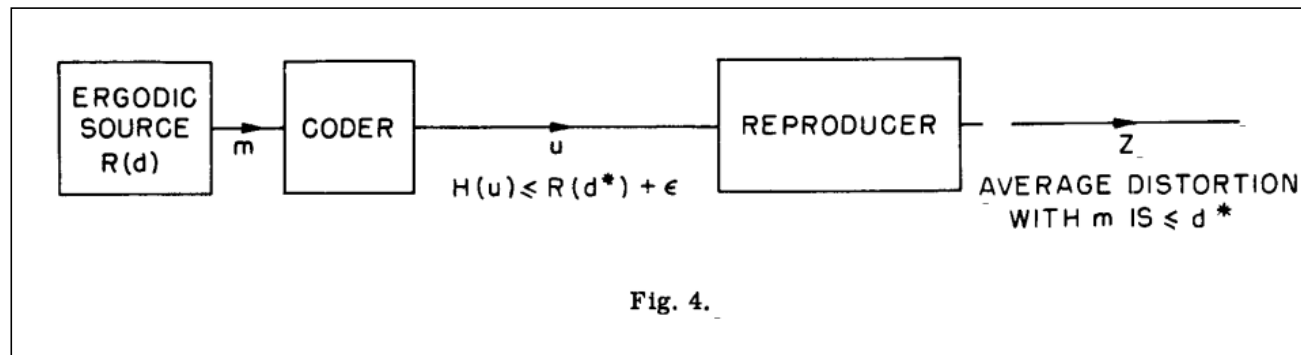
Fig. 2. Channel capacity C^* of bandlimited AWGN channels



Rate distortion theory

Coding Theorems for a Discrete Source With a Fidelity Criterion*

Claude E. Shannon**



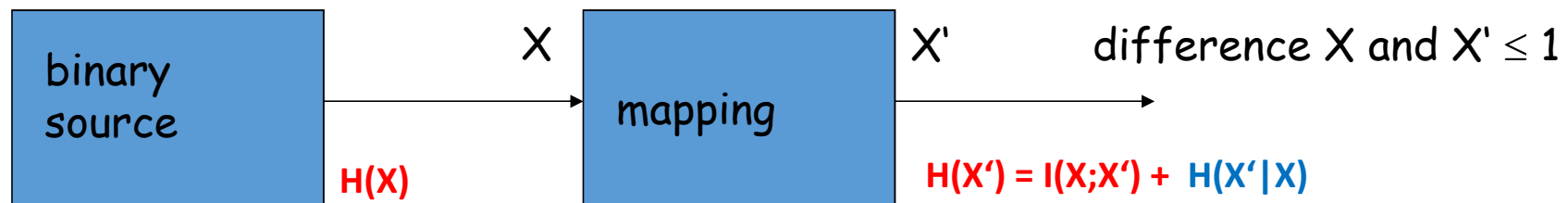
* Institute of Radio Engineers, *International Convention Record*, vol. 7, 1959.

** This work was supported in part by the U.S. Army (Signal Corps), the U.S. Air Force (Office of Scientific Research, Air Reserve and Development Command), and the U.S. Navy (Office of Naval Research).

Rate distortion theory (supposed to be difficult, covering problem)

Replace a source output X by another X' with average distortion $\leq D$: task is to minimize $H(X')$

example



since X is given, choose the quantizer (mapping of X to X')

Solution: the 16 Hamming codewords cover all sequences 128 of length 7 with a difference ≤ 1 .

Hence, the efficiency is $4/7$. How does it look like for general Hamming codes?

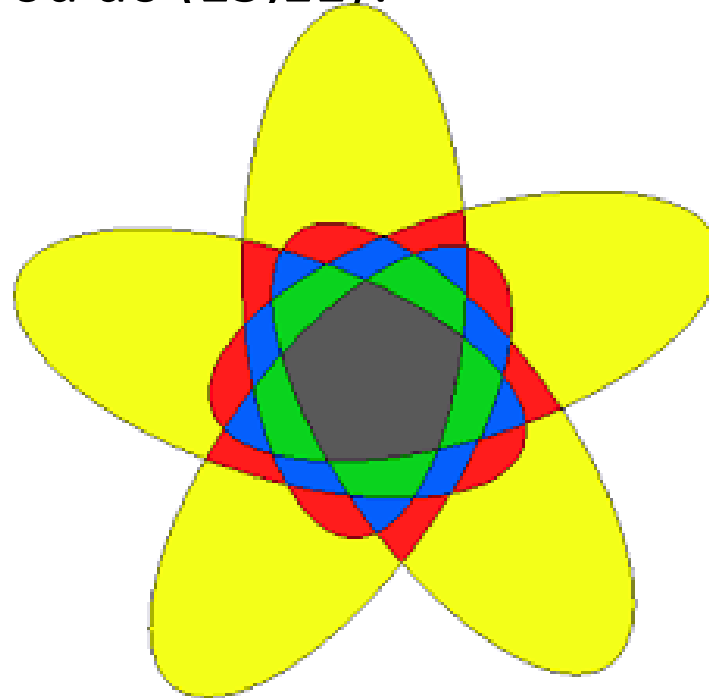
The Hamming codewords are linear combinations of the vectors: (1 0 0 0 1 1 1; 0 1 0 0 1 1 0; 0 0 1 0 1 0 1; 0 0 0 1 0 1 1)



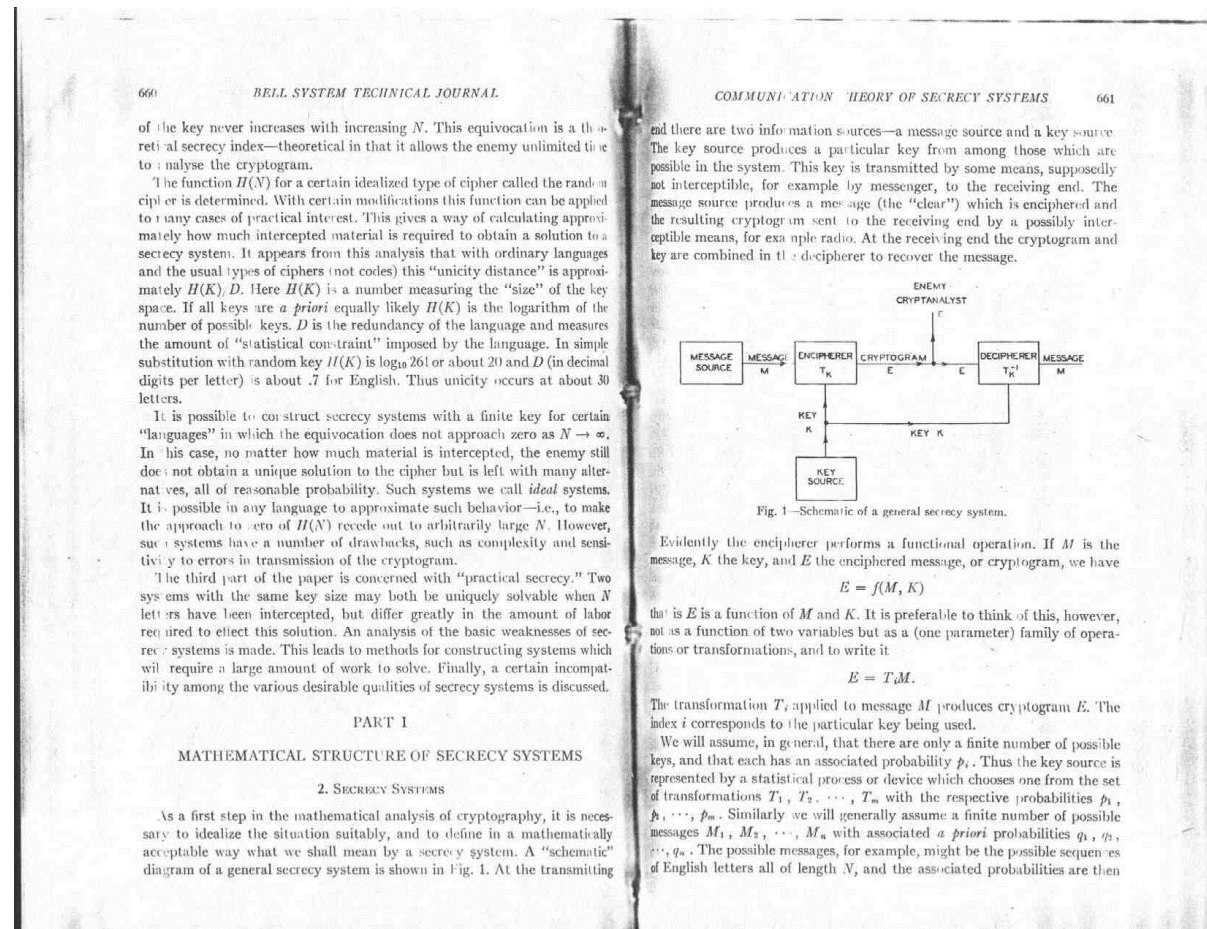
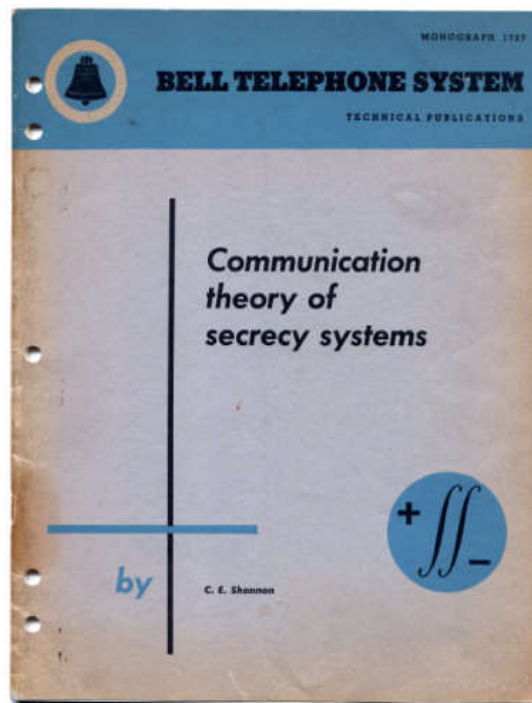
A Hamming code can be represented as Venn diagramm (why?)

6th Asia-Europe Workshop on Information Theory, Ishigaki Island, Okinawa

- Example (31,26). Can you do (15,11)?



Shannon's original crypto paper, 1949



Contribution still used in DES and AES

Confusion and Diffusion

Confusion

The relationship between the key and the ciphertext as complex and as involved as possible.

e.g. Enigma & complex substitution (S-boxes)

011011



Claude Shannon

S ₃		Middle 4 bits of input															
		0000	0001	0010	0011	0100	0101	0110	0111	1000	1001	1010	1011	1100	1101	1110	1111
Outer bits	00	0010	1100	0100	0001	0111	1010	1011	0110	1000	0101	0011	1111	1101	0000	1110	1001
	01	1110	1011	0010	1100	0100	0111	1101	0001	0101	0000	1111	1010	0011	1001	1000	0110
	10	0100	0010	0001	1011	1010	1101	0111	1000	1111	1001	1100	0101	0110	0011	0000	1110
	11	1011	1000	1100	0111	0001	1110	0010	1101	0110	1111	0000	1001	1010	0100	0101	0011

Diffusion

Statistics of the plaintext is "dissipated" in the statistics of the ciphertext. If we change a character of the plaintext, then several characters of the ciphertext should change.

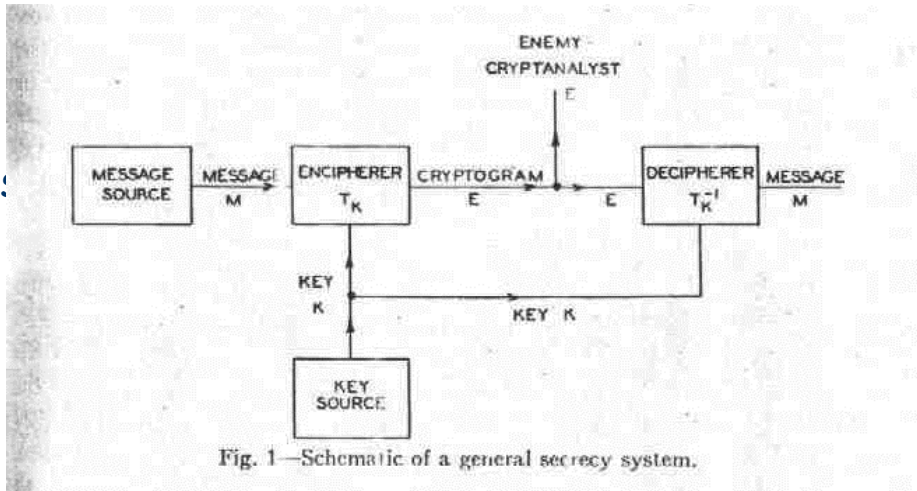
http://en.wikipedia.org/wiki/Permutation_box

14	17	11	24	1	5	3	28
15	6	21	10	23	19	12	4
26	8	16	7	27	20	13	2
41	52	31	37	47	55	30	40
51	45	33	47	44	48	38	56
34	53	46	42	50	36	29	32

P-Box



PERSPECTIVE OF SHANNON'S SECRECY SYSTEM

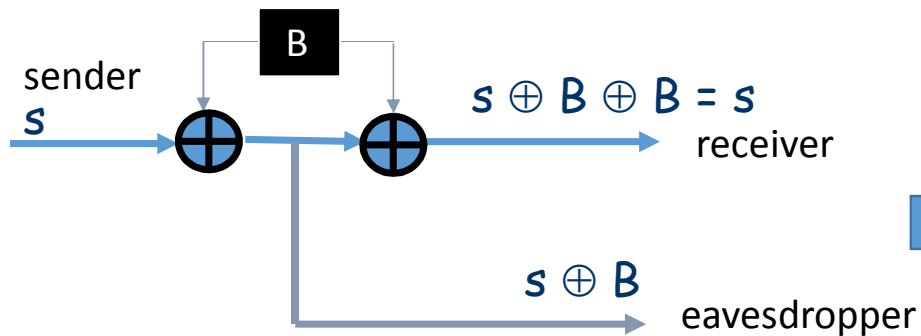


For Perfect secrecy we have a necessary condition:

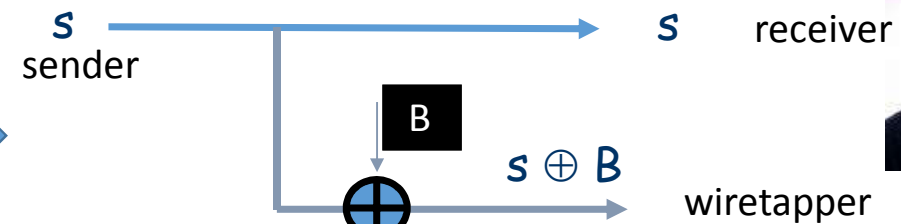
$$H(S|X) = H(S)$$

$$\Rightarrow H(S) \leq H(B)$$

i.e. # of messages \leq # of keys



Wiretap channel model



Aaron
Wyner

Secrecy rate: $C_s = H(B) = \text{amount of secret bits/tr}$

A.J. Han Vinck, Johannesburg, June 2016



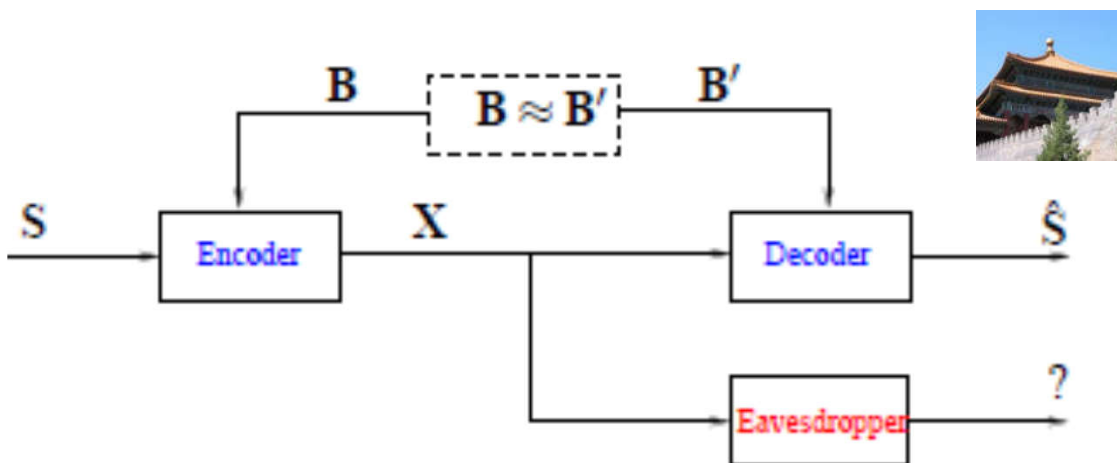
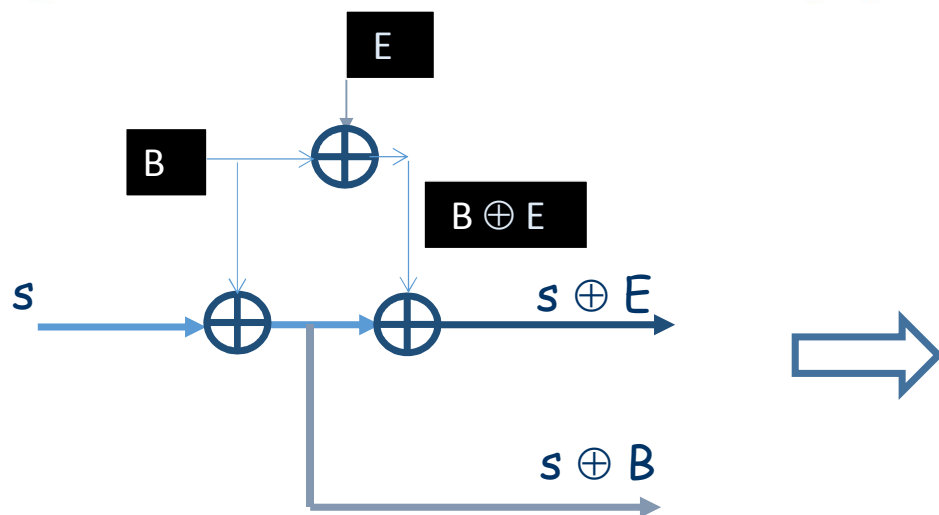
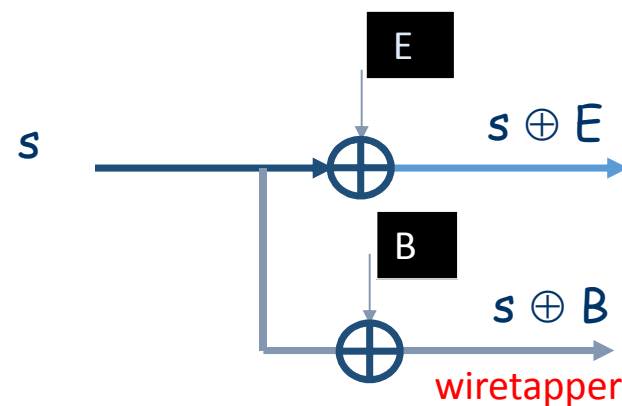


Figure 2: An extension of Shannon's secrecy system.



Wiretap channel model



Aaron
Wyner



Secrecy rate $C_s = H(B) - H(E) = \# \text{ secret bits/transmission}$

A.J. Han Vinck, Johannesburg, June 2016



TWO-WAY COMMUNICATION CHANNELS

CLAUDE E. SHANNON

MASSACHUSETTS INSTITUTE OF TECHNOLOGY
CAMBRIDGE, MASSACHUSETTS

1. Introduction

A two-way communication channel is shown schematically in figure 1. Here x_1 is an input letter to the channel at terminal 1 and y_1 an output while x_2 is an

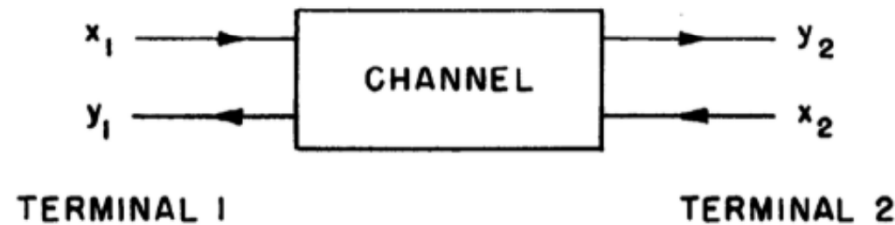


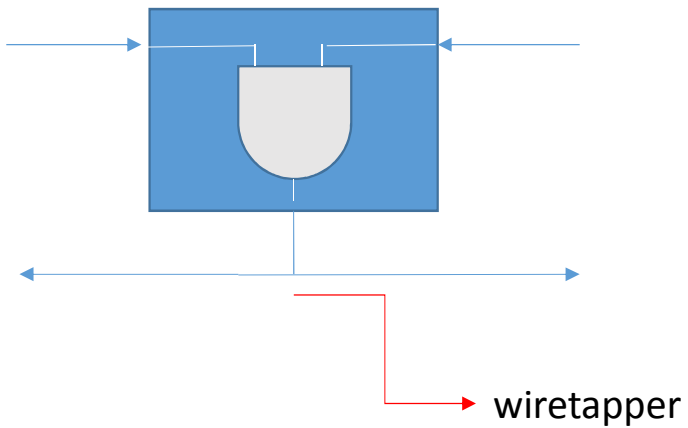
FIGURE 1

input at terminal 2 and y_2 the corresponding output. Once each second, say, new inputs x_1 and x_2 may be chosen from corresponding input alphabets and



Examples: binary input

	0	1
0	0	0
1	0	1



$x_2 \backslash x_1$	0	1
0	0	0
1	0	1

(a)

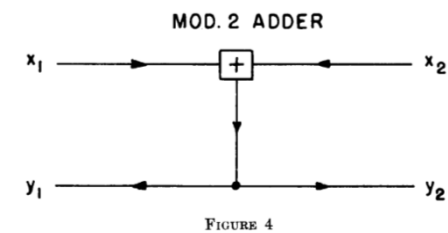
$x_2 \backslash x_1$	0	1
0	0	1
1	1	0

(b)

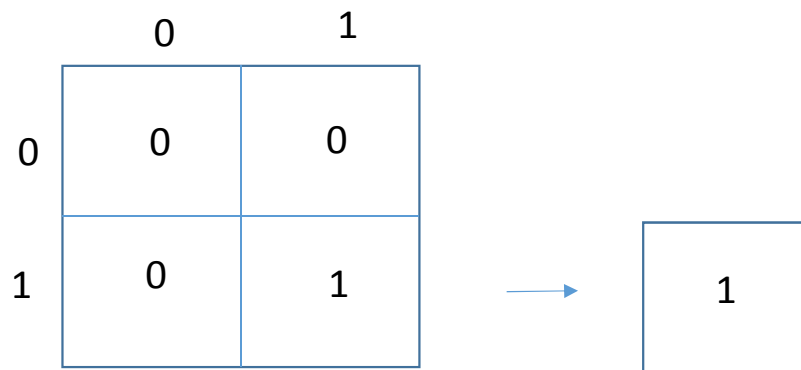
$x_2 \backslash x_1$	0	1
0	0	1
1	1	2

(c)

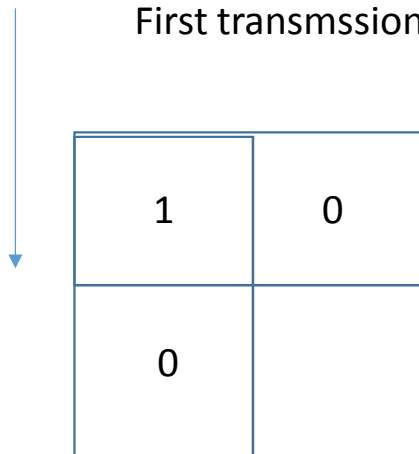
Only interesting cases!



A simple code: Hagelbarger code for the and



First transmsion



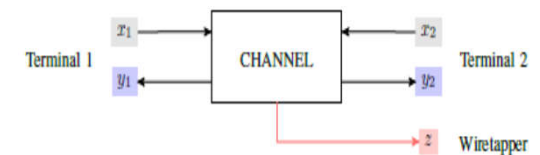
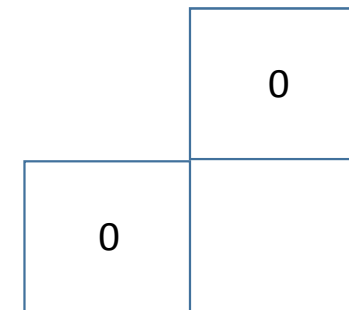
Second transmsion

Code word length (av) : $\frac{1}{4} \times 1 + \frac{3}{4} \times 2 = 7/4$

Rate/user = $4/7$ bit/tr

Wiretapper ambiguity: $\frac{1}{2} \times 1$ bit/square

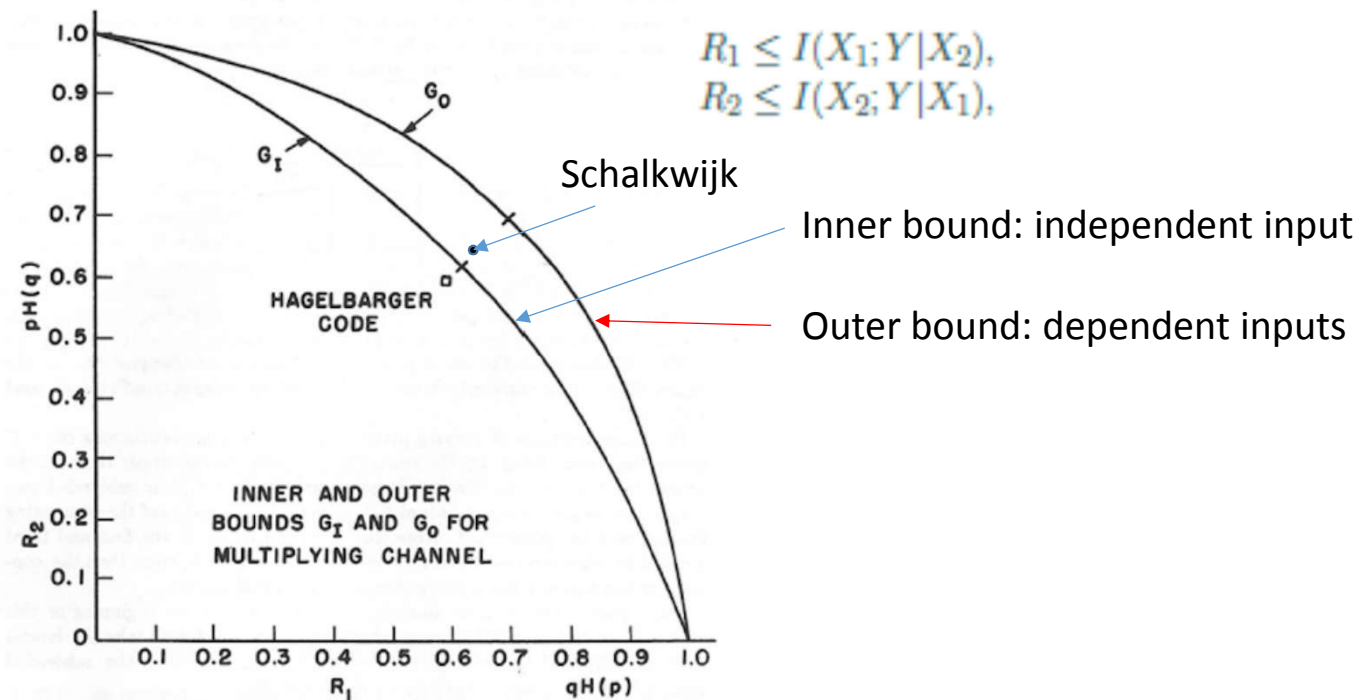
Hence: joint ambiguity = $2/7$ bit/tr



Only inner and outer bound are known (open)



David Hagelbarger at Bell labs



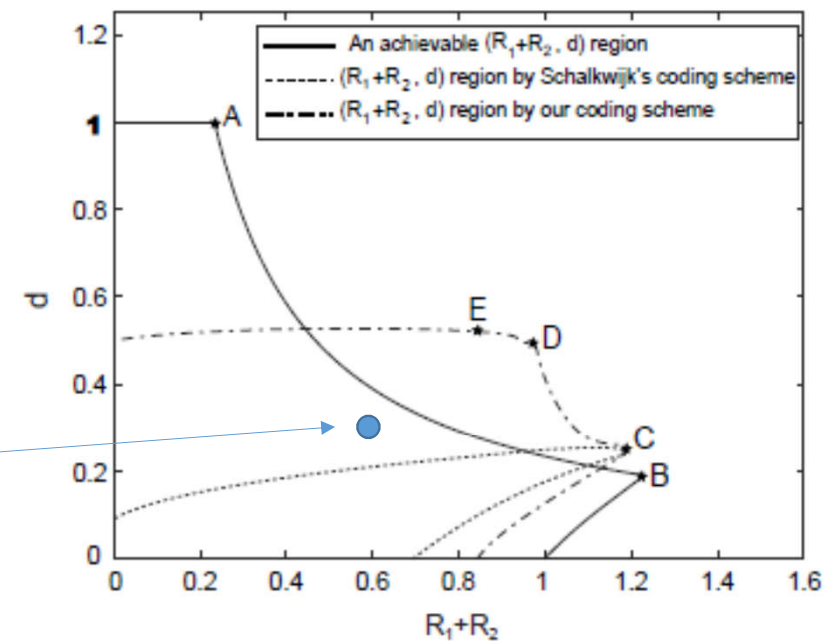
Achievable security:

rate

$$\begin{aligned}
 R_1 &\leq I(X_1; Y|X_2), \\
 R_2 &\leq I(X_2; Y|X_1), \\
 d &\leq 1, \\
 (R_1 + R_2)d &\leq I(X_1; Y|X_2) + I(X_2; Y|X_1) - I(X_1, X_2; Z),
 \end{aligned}$$

Secrecy

Hagelbarger

Figure 6: Comparison on the sum-rate equivocation $(R_1 + R_2, d)$ regions.

An interesting problem (smart grid)

- Suppose that - a question is public (give me your consumption,
- but the answer is secret (I used xx KWh)

What does it mean for the security?



One-sided secrecy over the two-way wiretap channel

Chao Qi*, Yanling Chen[†], A. J. Han.Vinck[†] and Xiaohu Tang*



One-sided secrecy over the two-way wiretap channel

Chao Qi*, Yanling Chen[†], A. J. Han-Vinck[†] and Xiaohu Tang*

Corollary 1. *For the two-way channel with an external eavesdropper such that $Y_1 = Y_2 = Z$, an achievable one-sided secrecy rate region is given by the union of non-negative rate pairs (R_{1e}, R_2) satisfying*

$$R_2 \leq I(X_2; Z|X_1),$$

$$R_{1e} \leq R_2 - I(X_2; Z),$$

over all $p(x_1)p(x_2)$.

$$P_{e,i} \leq \epsilon_n, \quad \text{for } i = 1, 2$$

$$\frac{1}{n} I(W_{1e}; Z^n) \leq \tau_n,$$

$$\lim_{n \rightarrow \infty} \epsilon_n = 0 \quad \text{and} \quad \lim_{n \rightarrow \infty} \tau_n = 0.$$

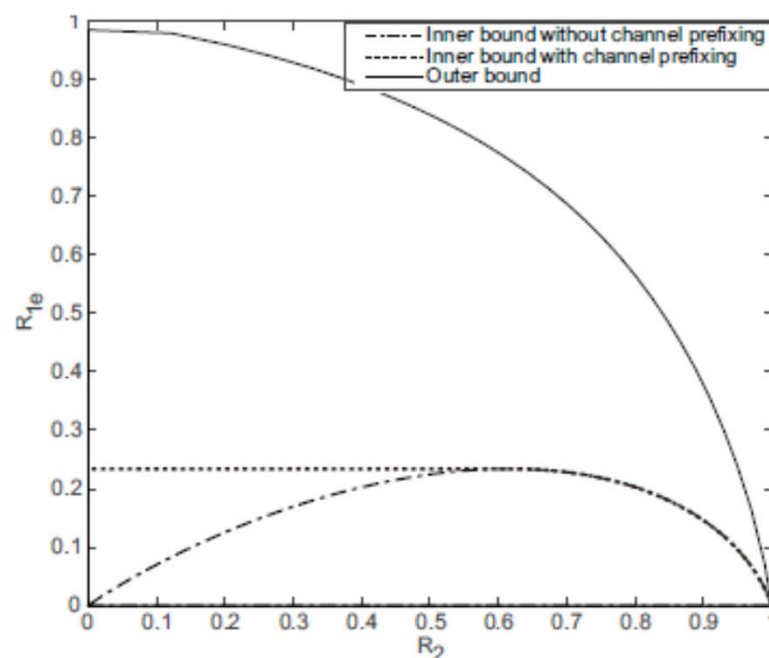
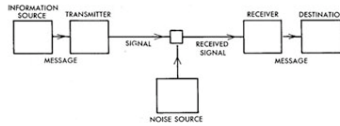
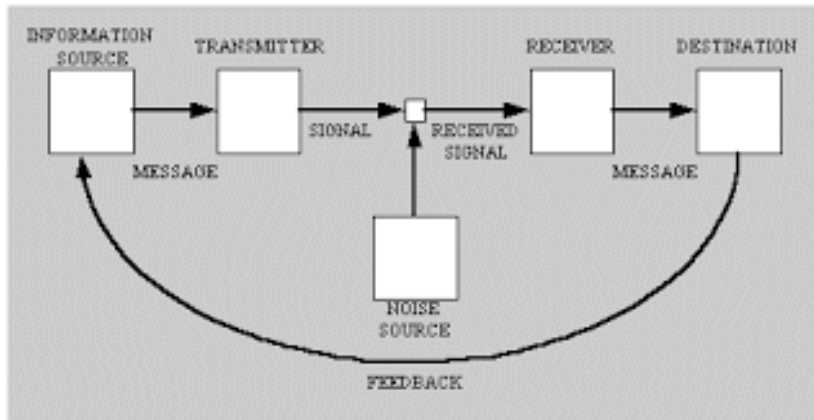


Fig. 3. The secrecy rate region for the BMC.





Shannon and feedback



One of the most surprising results in information theory was proven by Claude Shannon in 1956 [1]: instantaneous and noiseless feedback of the output of a discrete memoryless channel does not increase capacity. This

[1] C.E. Shannon, "The zero error capacity of a noisy channel," *IRE Trans. Inform. Theory*, vol. IT-2, pp. 8–19, September 1956.

But what about:

- Channels with memory
- Multi user channels like MAC?



Interesting observation from the two terminal paper from Shannon (1961)

17. Generalization to T-terminal channels

Many of the tricks and techniques used above may be generalized to channels with three or more terminals. However, some definitely new phenomena appear in these more complex cases. In another paper we will discuss the case of a channel with two or more terminals having inputs only and one terminal with an output only, a case for which a complete and simple solution of the capacity region has been found.

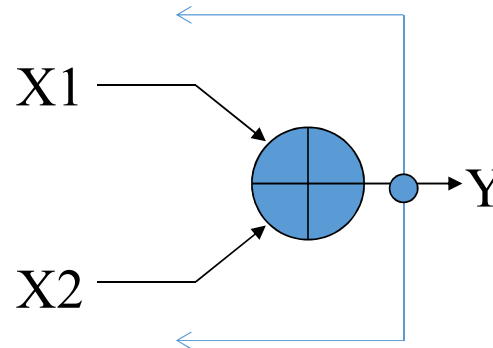
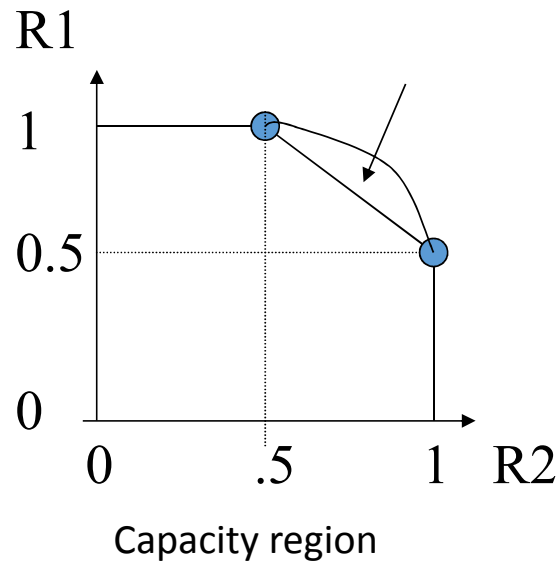


First results appear in: R. Ahlswede, "Multi-way communication channels," in Proceedings of 2nd International Symposium on Information Theory (Thakadsor, Armenian SSR, Sept. 1971), Publishing House of the Hungarian Academy of Science, Budapest, 1973, pp. 23–52





Two-adder with feedback improves over non-feedback!



model

X1		
1	0	
1	0	0
2	1	1
		X2

- Solution: users know each others input due to the feedback
- They solve the problem for the receiver in total cooperation (log 3 bits/transmission)

- [Coding Techniques and the Two-Access Channel](#), *In Multiple Access Channels: Theory and Practice* Eds. E. Biglieri, L. Györfi, pp. 273-286, IOS Press, ISBN, 978-1-58603-728-4, 2007



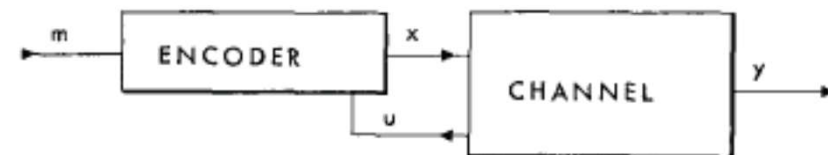
Channels with Side Information at the Transmitter

Abstract: In certain communication systems where information is to be transmitted from one point to another, additional side information is available at the transmitting point. This side information relates to the state of the transmission channel and can be used to aid in the coding and transmission of information. In this paper a type of channel with side information is studied and its capacity determined.

Introduction

Channels with feedback¹ from the receiving to the transmitting point are a special case of a situation in which there is additional information available at the transmitter which may be used as an aid in the forward transmission system. In Fig. 1 the channel has an input x and an output y .

Figure 1



Memory systems: defects known to writer, not to the reader

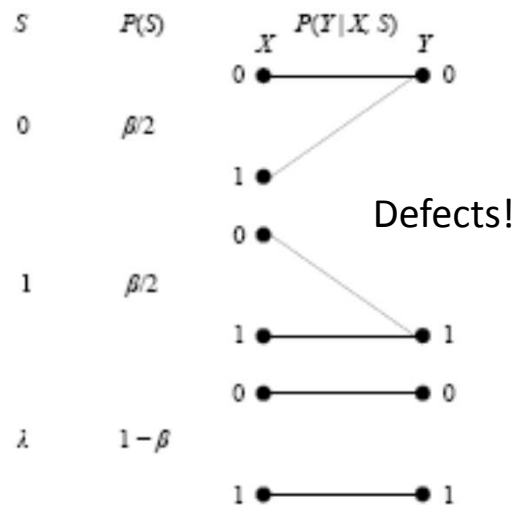
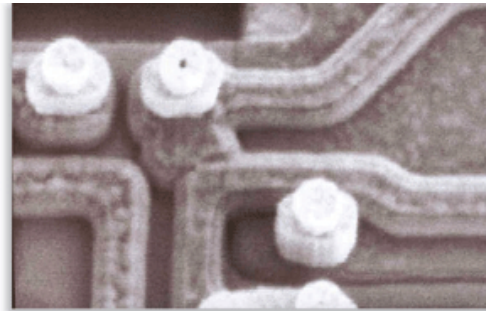


Fig. 1. Binary defect channel (BDC).

Capacity is $1-p$ bits/cell



RELIABLE CIRCUITS USING LESS RELIABLE RELAYS

BY

E. F. MOORE¹ AND C. E. SHANNON¹

The first kind of failure allowed is the failure of a relay contact to close, which in actual relays is often due to a particle of dust preventing electrical closure.

The second type of failure is the failure of a contact to open, which in actual relays is usually due to the welding action of the current passing through the contacts. We shall consider relay circuits in which



On the Influence of Coding on the Mean Time to Failure for Degrading Memories with Defects

HAN VINCK AND KAREL POST, MEMBER, IEEE

Q: how does coding influence the MTTF?

For the simplest, and perhaps most practical, situation where $d_{\min} = 3$, we get

$$\eta \cong \frac{k}{n} \sqrt{N}$$

N = number of words

IEEE TRANSACTIONS ON INFORMATION THEORY, VOL. 40, NO. 6, NOVEMBER 1994

On the General Defective Channel with Informed Encoder and Capacities of Some Constrained Memories

Alexander V. Kuznetsov and A. J. Han Vinck

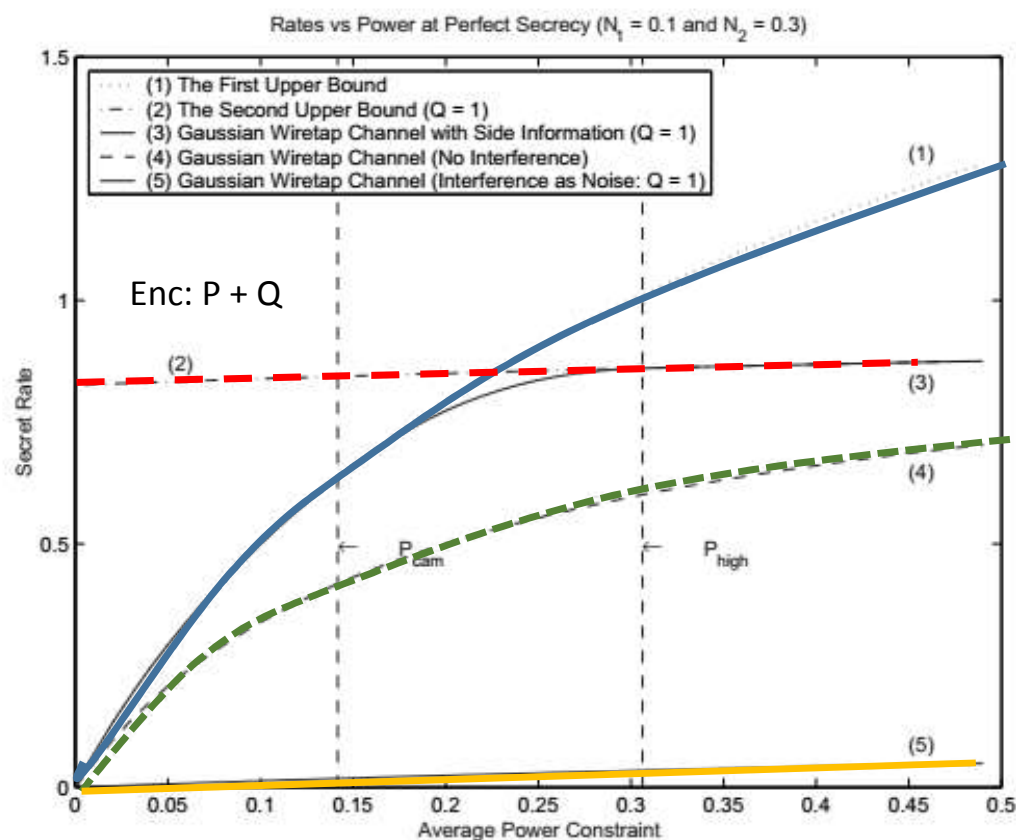


Sacha Kuznetsov

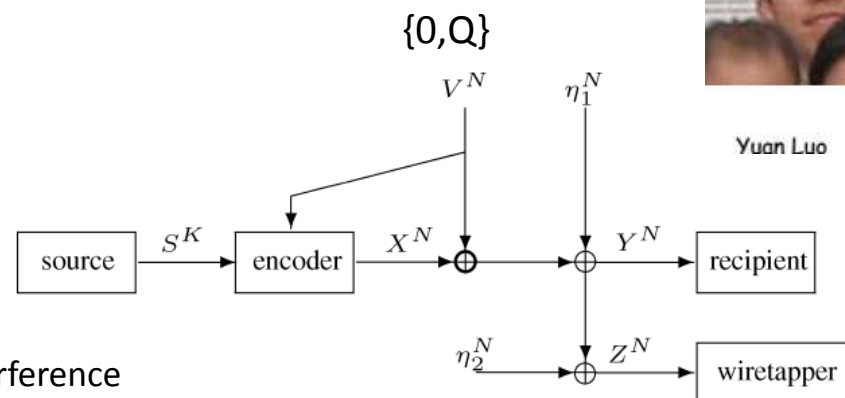


An Achievable Region for the Gaussian Wiretap Channel with Side Information,

IEEE Transactions on Information Theory, May 2006, C. Mitrpant, A.J. Han Vinck and Yuan Luo, iSSN 0018-9448



C_M



Yuan Luo

No interference

Index Terms—Dirty-paper channel, Gaussian wiretap channel, Gaussian wiretap channel with side information, perfect secrecy.

No CSI



CONSTRAINED SEQUENCES from the 1948 paper

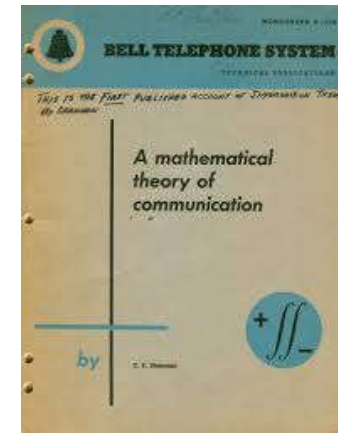
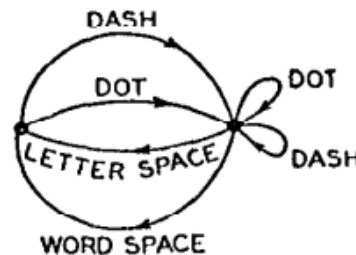


Fig. 2—Graphical representation of the constraints on telegraph symbols.

FIGURE 2!

In the more general case with different lengths of symbols and constraints on the allowed sequences, we make the following definition:

Definition: The capacity C of a discrete channel is given by

$$C = \lim_{T \rightarrow \infty} \frac{\log N(T)}{T}$$



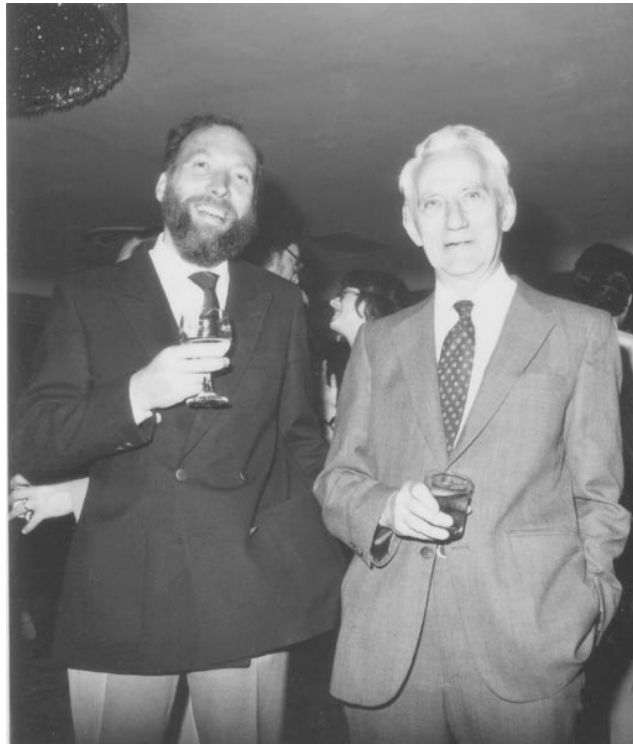
where $N(T)$ is the number of allowed signals of duration T .



„Our“ Kees Immink got famous for using constrained sequences for CD!



Johannesburg, 2014



- **AES Convention, New York, 1985**
- Claude Shannon, and Kees Immink

A.J. Han Vinck, Johannesburg, June 2016

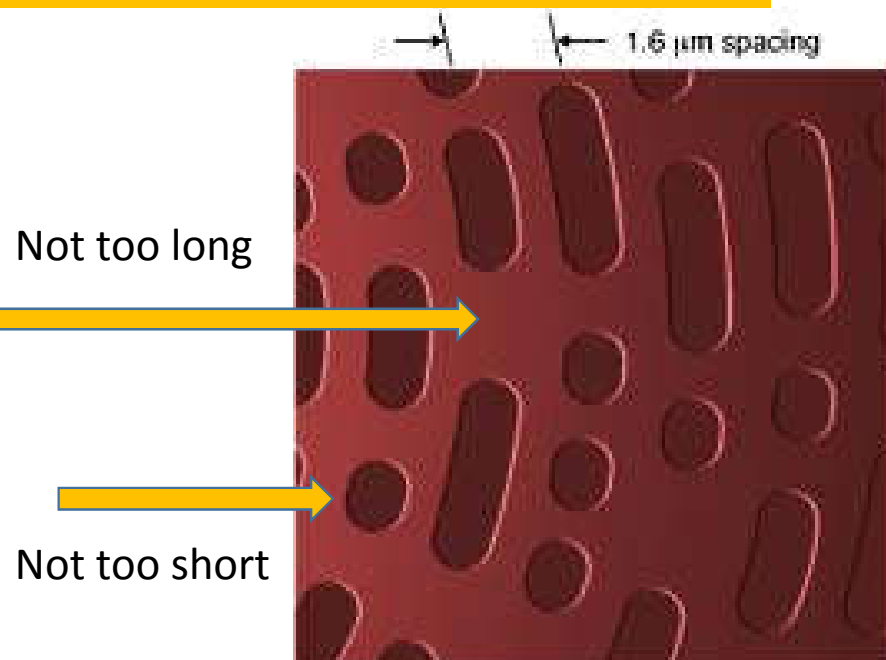


Johannesburg, 1994



What are the symbol constraints for writing on a CD ?

Symbol length has discrete values!



Long „CONSTANT“ sequences give synchronization problems

0.83 μm
minimum

Short symbol duration gives detection problems

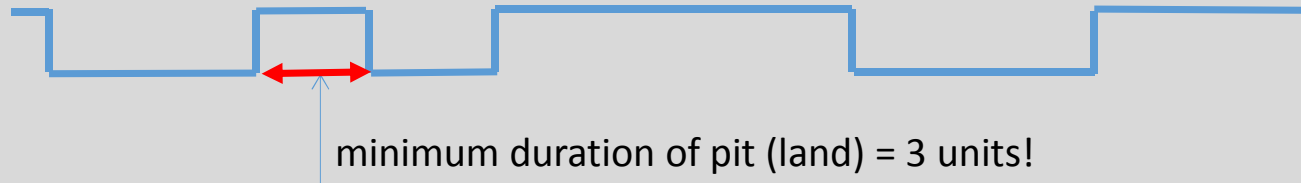


a remarkable observation can be made

Constrained code:

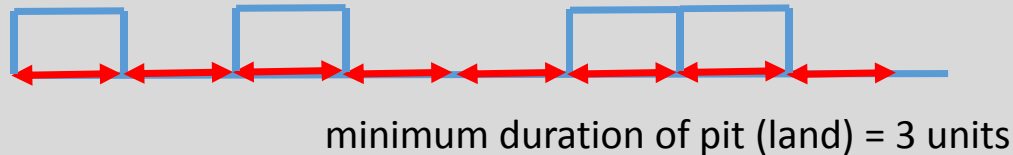
0 1 0 0 0 0 1 0 0 1 0 0 1 0 0 0 0 0 0 0 1 0 0 0 0 0

8 information bits
in 17(16) positions



Traditional coding: the length of pits and lands is a multiple of the minimum duration

8 information bits
in 24 positions



DENSITY GAIN
 $\approx 40\%$

[Coded modulation with a constraint on the minimum channel symbol duration](#), Mengi, A.J. Han Vinck,
Conference Proceeding: 08/2009; DOI: 10.1109/ISIT.2009.5205832In proceeding of: IEEE International,
Symposium on Information Theory, 2009. ISIT 2009.



Optical rewritable disk(Sony): writing only in 1 direction

Example: 6 messages, word length $n = 5 \Rightarrow R = 0.51 > 0.5$!

6 messages	code book 0 → 1			code book 1 → 0		
	0 0 0 0 0			1 1 1 1 1		0
	1 0 0 0 0	0 1 0 0 1	←	0 1 1 1 1	1 0 1 1 0	1
	0 1 0 0 0	1 0 1 0 0		1 0 1 1 1	0 1 0 1 1	2
	0 0 1 0 0	0 1 0 1 0	→	1 1 0 1 1	1 0 1 0 1	3
	0 0 0 1 0	0 0 1 0 1		1 1 1 0 1	1 1 0 1 0	4
	0 0 0 0 1	1 0 0 1 0		1 1 1 1 0	0 1 1 0 1	5



Property: from any code word in code book 0 \rightarrow 1 to any word in code book 1 \rightarrow 0 and back

Example: 0 0 0 1 0 \rightarrow 0 1 0 **1** 1 \rightarrow **0** 0 **0** 1 0 \rightarrow 1 0 1 **1** 0 ...
 0 \rightarrow 1 1 \rightarrow 0 0 \rightarrow 1

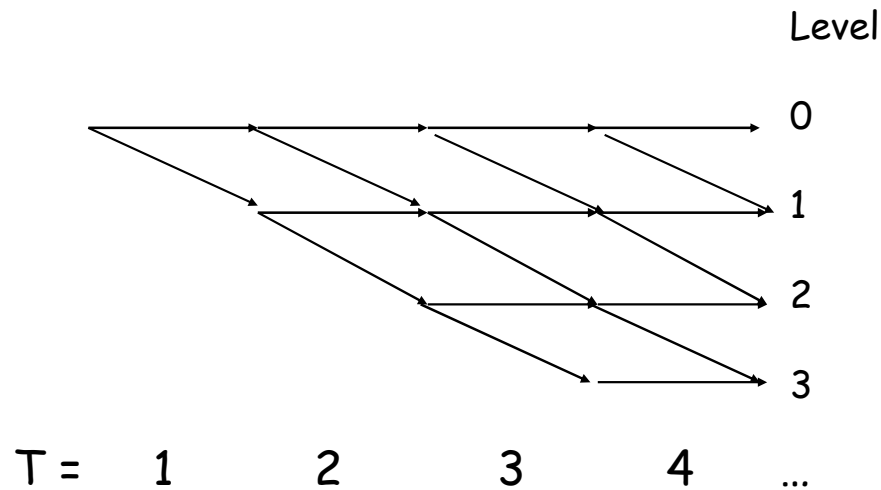
Still work to do!

F. M. J. Willems and A. J. H. Vinck, "Repeated recording for an optical disk", *Proc. 7th Symp. Information Theory in the Benelux*, pp.49 -53 1986



Generalized WOM (flash), model

Example: $q = 4$
1 step increment



$\text{Log}(\# \text{ sequences}) \approx ?$

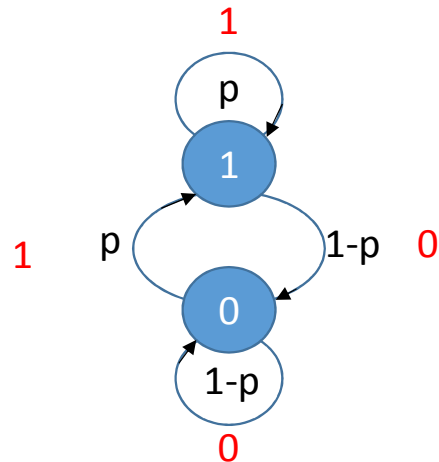
$\text{Log}(\# \text{ sequences}) \approx (q-1) \log_2 (T+1)$ a factor of $(q-1)!!$ more than the binary WOM

On the Capacity of Generalized Write-Once Memory with State Transitions Described by an Arbitrary Directed Acyclic Graph, Fang-Wei Fu and A. J. Han Vinck,
IEEE TRANSACTIONS ON INFORMATION THEORY, VOL. 45, NO. 1, JANUARY 1999

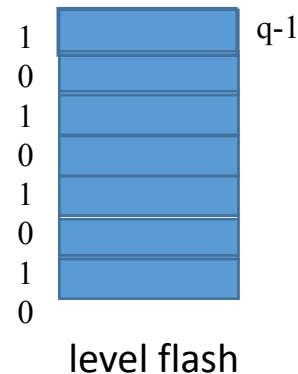
A.J. Han Vinck, Johannesburg, June 2016



Performance 1 step-up for q-ary flash memory where $P(1) = p$



average increase
 $2p(1-p)$ per writing



average number of writes
to reach top level (erase)

$$w = (q-1)/2p(1-p)$$

Average amount of information stored $w \times h(p)$

$$\approx \frac{1}{2} (q-1) \log_2(T+1) \text{ for } p = 1/(T+1)$$

Conclusion: storage capacity improved
average time before erasure $w \approx Tq/2$



Communication in the Presence of Noise

CLAUDE E. SHANNON, MEMBER, IRE

This paper is reprinted from the PROCEEDINGS OF THE IRE, vol. 37, no. 1, pp. 10–21, Jan. 1949.

X. THE CHANNEL CAPACITY WITH AN ARBITRARY TYPE OF NOISE

Of course, there are many kinds of noise which are not Gaussian; for example, impulse noise, or white noise that has passed through a nonlinear device. If the signal is perturbed by one of these types of noise, there will still be a definite channel capacity C , the maximum rate of transmission of binary digits. We will merely outline the general theory here.¹⁰

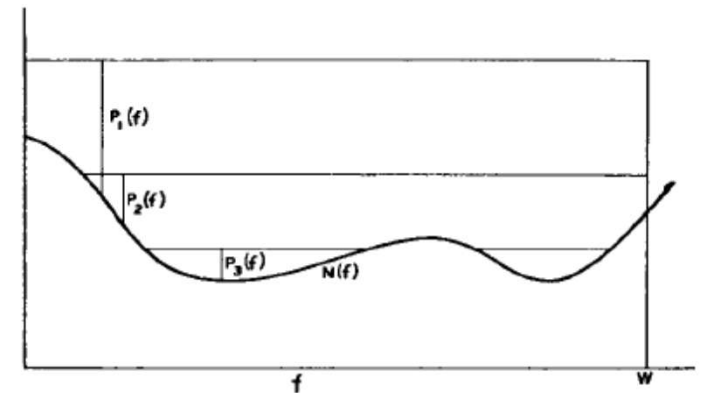
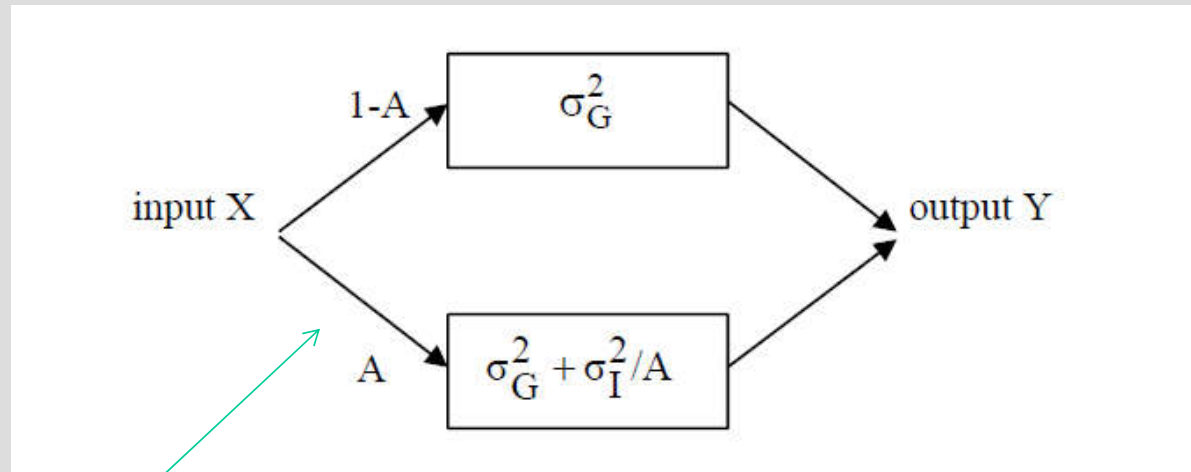


Fig. 8. Best distribution of transmitter power.

The waterfilling argument



A simple two states impulse model



A influences the **frequency** of occurrence of impulse noise

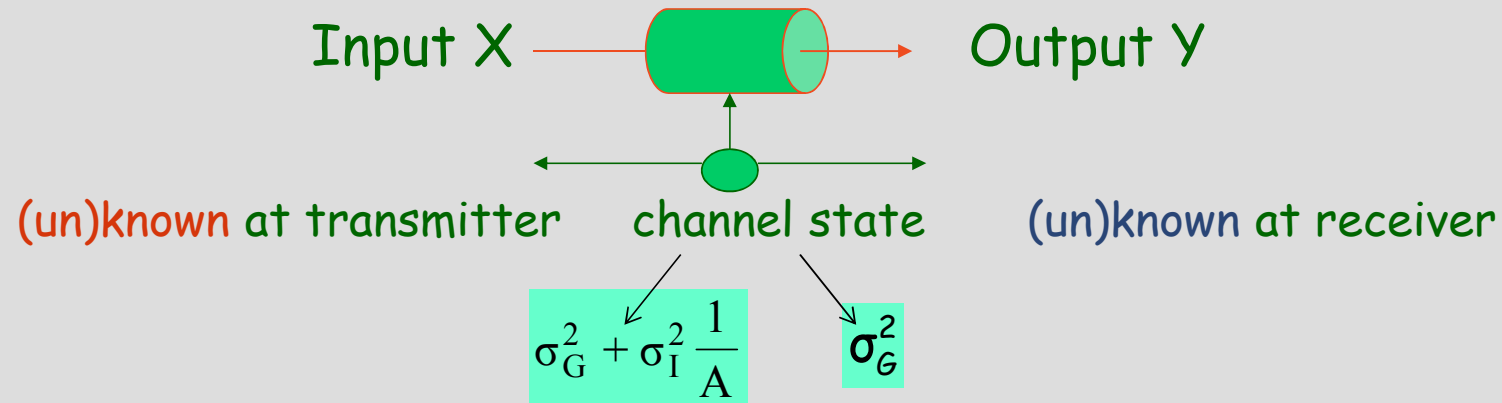
for $\sigma_I^2 = \sigma_G^2/T$

Example: average frequency of impulse $A = 0.1$; $T = 0.01$

$$\overline{\sigma^2} = \sigma_G^2 + \sigma_I^2 = 101 \sigma_G^2; \quad \sigma_G^2 + \sigma_I^2 \frac{1}{A} = 1001 \sigma_G^2$$



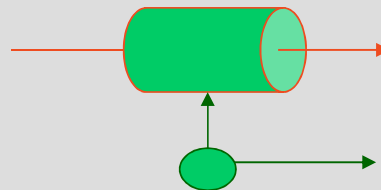
Middleton class-A noise model: what is the channel capacity?



Q1: channel capacity ?

It is not realistic to assume that the transmitter knows the state

Thus, **Q2: what happens if only the receiver knows the state?**



What can we gain by using the channel state? (memory of the noise)

- Using waterfilling argument (high P)

$$(low\ power) capacity(++) = (1 - A) \text{Blog}_2 \left(1 + \frac{P/2B(1-A)}{\sigma_G^2} \right)$$

$$capacity(+ +) = (1 - A) \text{Blog}_2 \left(1 + \frac{\sigma_I^2 + P/2B}{\sigma_G^2} \right) + A \text{Blog}_2 \left(\frac{\sigma_G^2 + \sigma_I^2 + P/2B}{\sigma_G^2 + \sigma_I^2 / A} \right)$$

- Using Gaussian input with average power $\leq P$

$$capacity(- +) = (1 - A) \text{Blog}_2 \left(1 + \frac{P/2B}{\sigma_G^2} \right) + A \text{Blog}_2 \left(\frac{\sigma_G^2 + \sigma_I^2 / A + P/2B}{\sigma_G^2 + \sigma_I^2 / A} \right)$$

- The randomized (Gaussian) channel



$$capacity(-, -) = \text{Blog}_2 \left(1 + \frac{P/2B}{\sigma_G^2 + \sigma_I^2} \right)$$

$$\text{gain} \approx 10 \log_{10} \left(1 + \frac{\sigma_I^2}{\sigma_G^2} \right) \text{ dB}$$



1956, Shannon and the „BANDWAGON“

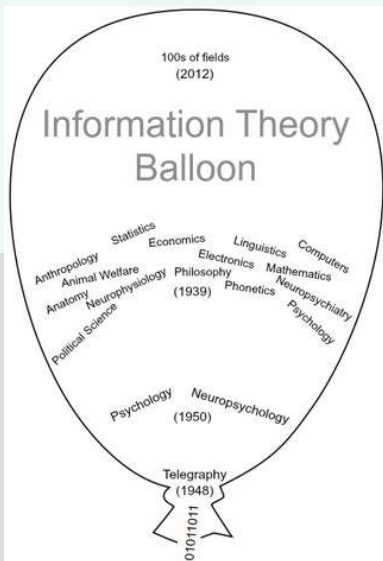
- Shannon was critical about „his information theory“

tions. I personally believe that many of the concepts of information theory will prove useful in these other fields—and, indeed, some results are already quite promising—but the estab

is not a trivial matter of order. The subject of information theory has cer-
domain, but rather the tainly been sold, if not oversold. We should now turn
hypothesis and experim our attention to the business of research and devel-

Secondly, we must keep our own house in first class
tain. Research rather than exposition is the keynote, and our critical thresholds should be raised. Authors should submit only their best efforts, and these only after careful criticism by themselves and their colleagues. A few first rate research papers are preferable to a large number that are poorly conceived or half-finished. The latter are no credit to their writers and a waste of time to their readers. Only by maintaining

tain. Research rather than exposition is the keynote, and our critical thresholds should be raised. Authors should submit only their best efforts, and these only after careful criticism by themselves and their colleagues. A few first rate research papers are preferable to a large number that are poorly conceived or half-finished. The latter are no credit to their writers and a waste of time to their readers. Only by maintaining



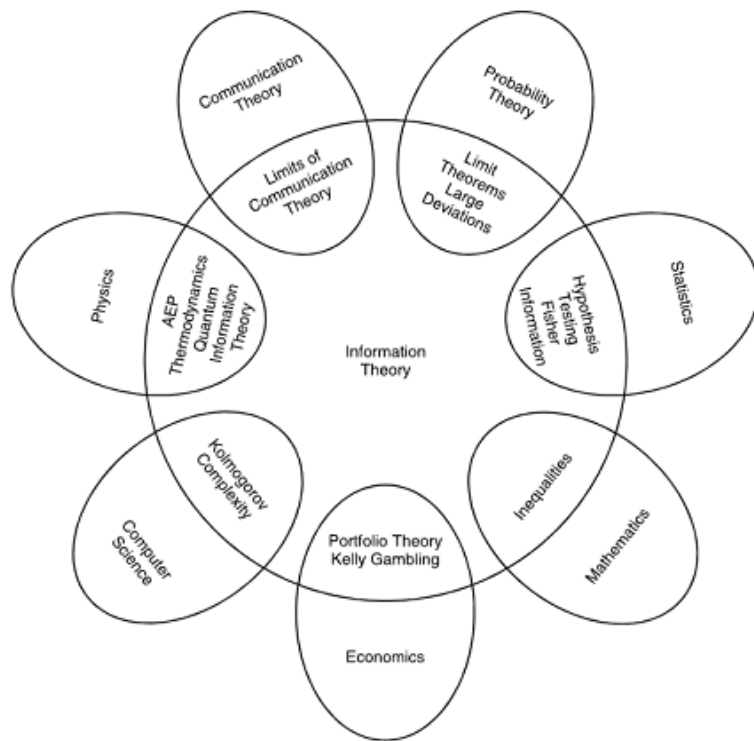
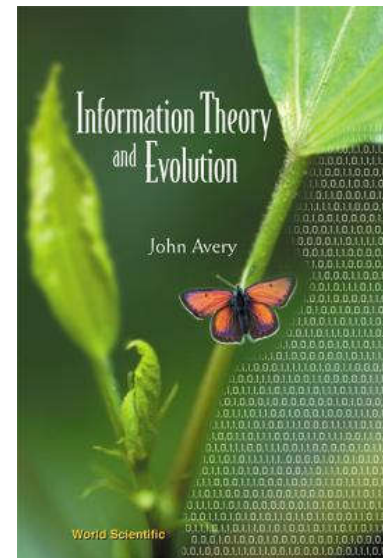
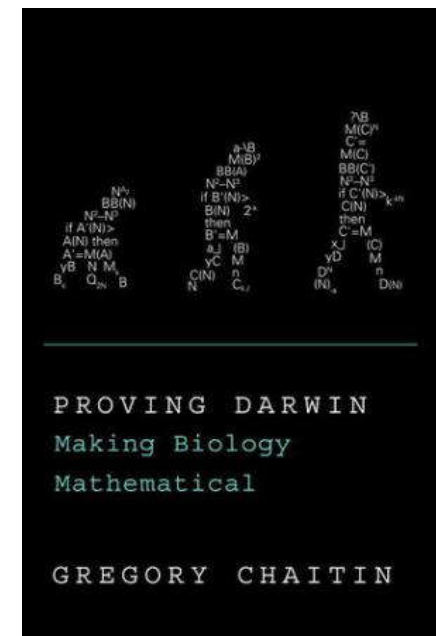
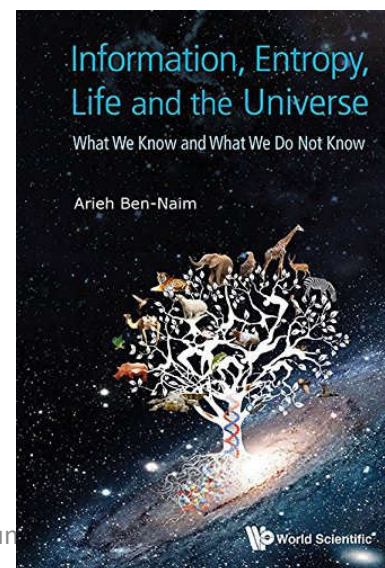


FIGURE 1.1. Relationship of information theory to other fields.



There are also other books than we are used to!



PLAY is the only way
the highest intelligence of humankind
can unfold

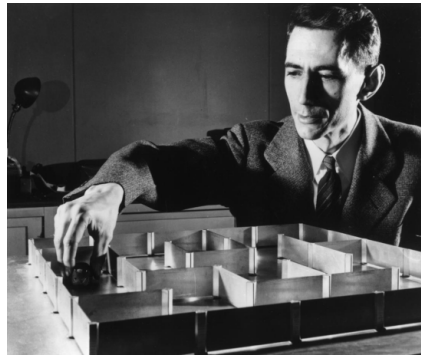
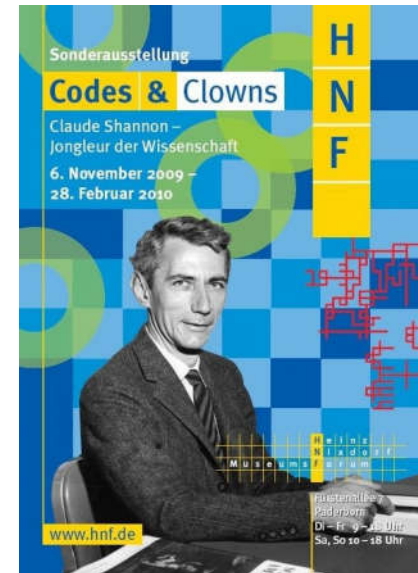
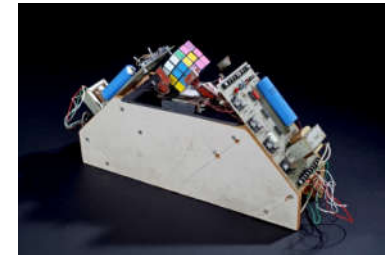
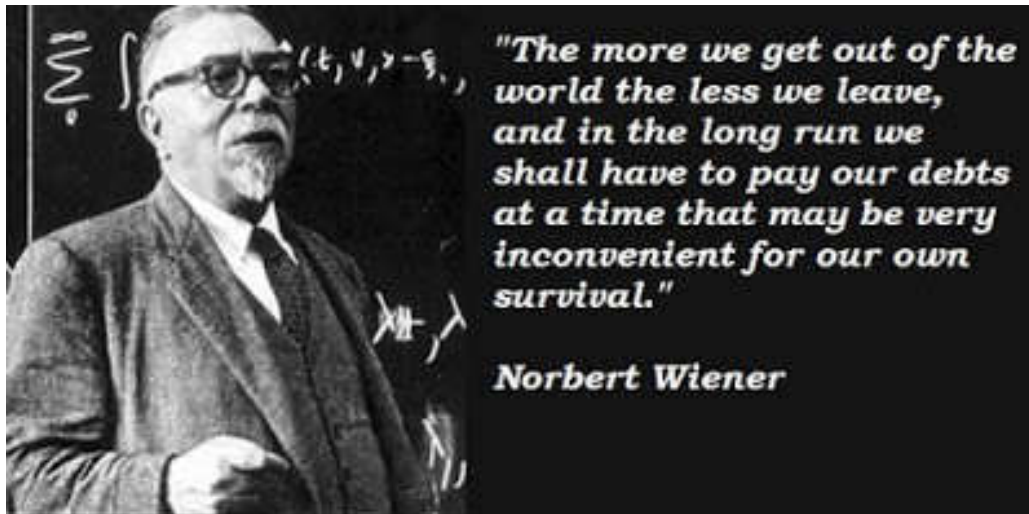


Photo: © Stanley Rownt

A.J. Han Vinck, Johannesburg, June 2016



Wiener influenced Shannon at MIT



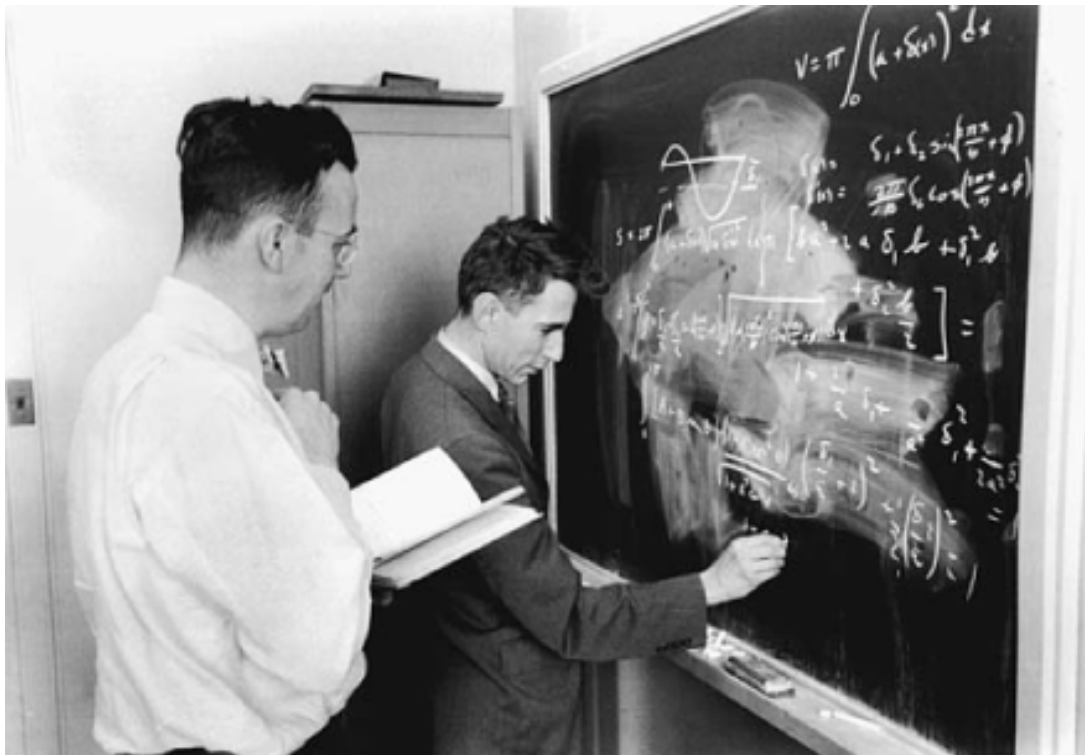
[Norbert Wiener](#) defined cybernetics in 1948 as

"the scientific study of control and communication in the animal and the machine."^[2]

The word *cybernetics* comes from [Greek](#) κυβερνητική (*kybernetike*),



Dave Hagelbarger and Claude Shannon



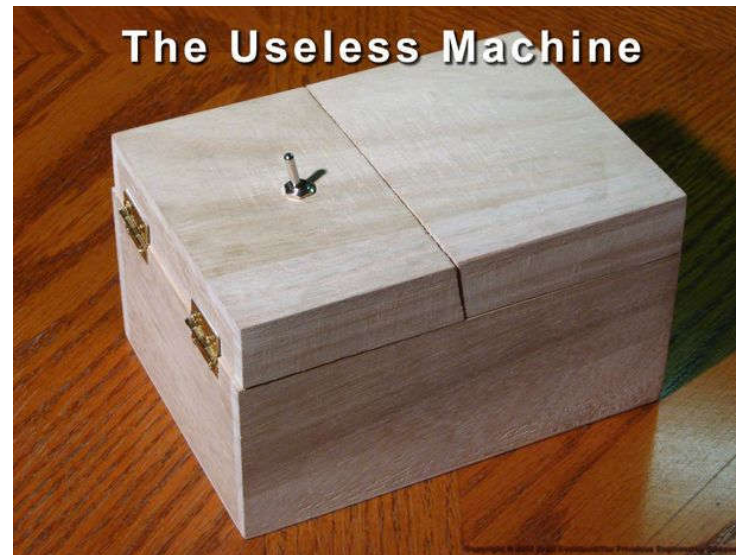
Claude Shannon's 1953
Outguessing Machine, at the MIT Museum.

(both Hagelbarger and Shannon produced a
guessing machine)



Shannon and the useless (ultimate) machine

- Many intelligent machines were produced (see Wikipedia), but also ...
- <https://youtu.be/urgL4Br2rql>



A.J. Han Vinck, Johannesburg, June 2016

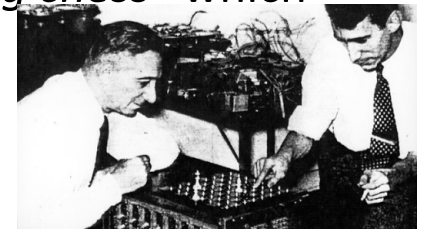


Summary of some other contributions of Shannon

- artificial intelligence, or AI.



- In 1950 he wrote a paper called "*Programming a digital computer for playing chess*" which essentially invented the whole subject of computer game playing.



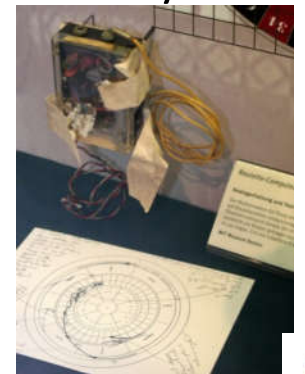
- JUGGLING (THEOREM)



Scientific American

[14] C.E. Shannon. Scientific aspects of juggling. In N. Sloane and A. Wyner, editors, *Claude Elwood Shannon – Collected Papers*, pages 850–864. IEEE Press, 1993.

- apply mathematics to beat the game of roulette. Thorp and Shannon build what is widely regarded to be the first wearable computer.



- Stock market/gambling



A.J. Han Vinck, Johannesburg, June 2016



retirement is a transition from whatever you were doing to whatever you want to do, at whatever rate you want to make the transition."

• W



"Look here Wat



A.J. Han Vinck, Johannesburg, June 2016



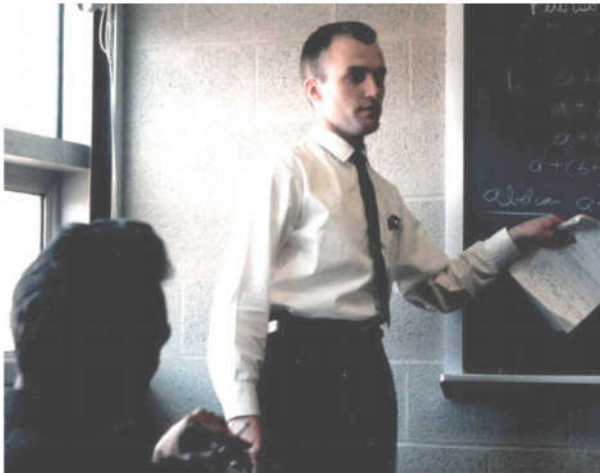
In Germany
Very famous
Gasthaus Petersberg,
Bonn



Claude E. Shannon

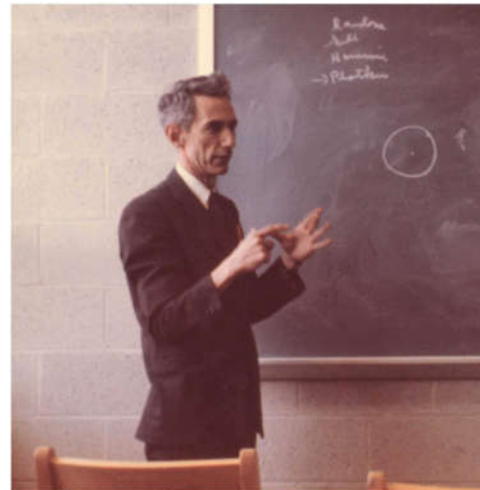


1961 **Claude Elwood Shannon**



17 April
1961

Claude Elwood Shannon



Left photo: Shannon, 1939, in a Piper Cub,