# An introduction to error correcting codes

Mathematics sin fronteras

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### Mariner 9

From Wikipedia, the free encyclopedia

Mariner 9 (Mariner Mars '71 / Mariner-I) was a robotic space probe that contributed greatly to the exploration of Mars and was part of the NASA Mariner program. Mariner 9 was launched toward Mars on May 30, 1971<sup>[112]</sup> from LC-36B at Cape Canaveral Air Force Station, Florida, and reached the planet on November 14 of the same yea;<sup>1112]</sup> becoming the first spacecraft to orbit another planet<sup>[5]</sup> – only narrowly beating the Soviet probes Mars? 2 (launched May 19) and Mars' 3 (launched May 28), which both arrived at Mars only weeks later.

After the occurrence of dust storms on the planet for several months following its arrival, the orbiter managed to send back clear pictures of the surface. Mariner 9 successfully returned 7,329 images over the course of its mission, which concluded in October 1972.<sup>[4]</sup>

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#### Mariner 9



Mission duration	1 year, 4 months, 27 days			
Spacecraft properties				
Manufacturer	Jet Propulsion Laboratory			
Launch mass	997.9 kilograms (2,200 lb)			

### Figure: https://en.wikipedia.org/wiki/Mariner\_9



#### Construction [edit]

The ultraviolet spectrometer aboard Mariner 9 was constructed by the Laboratory for Atmospheric and Space Physics at the University of Colorado, Boulder, Colorado. The ultraviolet spectrometer team was led by Professor Charles Barth.

The Infrared Interferometer Spectrometer (IRIS) team was led by Dr. Rudolf A. Hanel from NASA Goddard Spaceflight Center (GSFC). The IRIS instrument was built by Texas Instruments, Dallas, Texas.

The Infrared Radiometer (IRR) team was led by Professor Gerald Neugebauer from the California Institute of Technology (Caltech).

#### Error-Correction Codes achievements [edit]

Ascharate of Marine 9, showing the major component and features

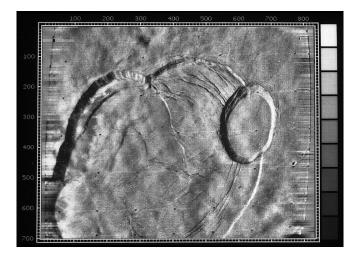
To control for errors in the reception of the grayscale image data sent by Mariner 3 (caused by a low signal-to-noise ratio), the data had to be encoded before transmission using a so-called forward error-correcting code (FEC). Without FEC, noise would have made up roughly a quarter of a received image, while the FEC encoded the data in a redundant way which allowed for the reconstruction of most of the sent image data at received.

Since the flown hardware was constrained with regards to weight, power consumption, storage, and computing power, some considerations had to be put into choosing an FEC, and it was decided to use a Hadmand code for Marine 9. Each maps period was represented as a six-bit binary value, which had 64 possible gravicale levels. Because of limitations of the transmitter, the maximum useful data length was about 30 bits, Instead of using a repetition code, a [32, 6, 16] Hadamard code was used, which is also a Hadromet Possible gravicale levels. Because of limitations of the transmitter, the maximum useful data length was about 30 bits, Instead of using a repetition code, a [32, 6, 16] Hadamard code was used, which is also a Hadromet Possible gravitation was able to be served bits per each 32-bit word could be corrected using this scheme.<sup>100111</sup> Compared to a five-repetition code, the error correcting properties of this Hadamard code was cannot be transmitter. The maximum first efficient deciding algorithm was an important factor in the decision to use this code. The circuitry used was called the "Green Machine", which employed the fast Fourier transmom, increasing

Figure: https://en.wikipedia.org/wiki/Mariner\_9



# Mariner 9 image of the central caldera of the Martian volcano, Olympus Mons.



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Figure: https://nssdc.gsfc.nasa.gov/imgcat/html/object\_page/m09\_mtvs4265\_52.html UNL - FACULTAD DE INGENIERÍA QUÍMICA Patricia "Patsy" Conklin, an employee in the Bioscience and Planetology Section at NASA's Jet Propulsion Laboratory assembles Mariner 9 photos into large mosaics.



Figure: https://www.upi.com/Top\_News/2020/05/30/On-This-Day-Mariner-9-launched-toward-Mars/4991590342141/ UNL-FACULTAD DE INGENIERÍA QUÍMICA

## Example: Transmission of pictures from NASA spaceships





Each picture was partitioned into  $200 \times 200$  pixels and each image pixel was represented as a six-bit binary value, which had 64 possible grayscale levels from white (000000) to black (111111).



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The total number of binary digits per picture was 240000. Each individual photograph took approximately six hours to be transmitted back to Earth.



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All images were stored onto a on-board magnetic tape recorder and then sent to our planet. All images were transmitted twice to ensure no data was missing or corrupt.



## Mariner 4, 1964 1965

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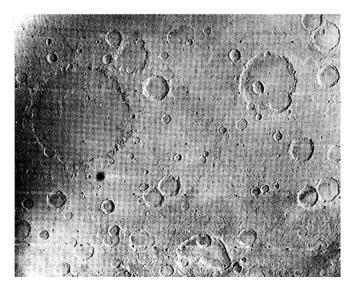
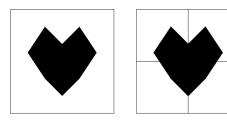


Figure: Photo:NASA

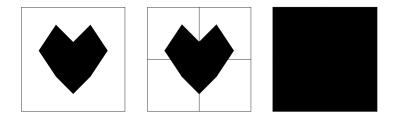






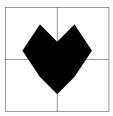




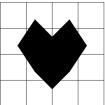




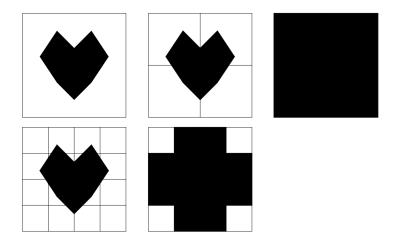










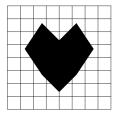


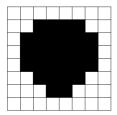




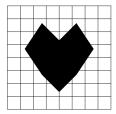


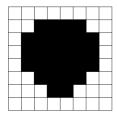


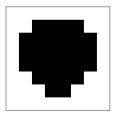




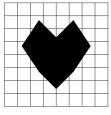


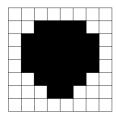


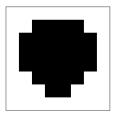






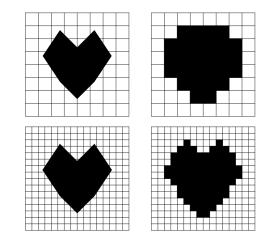


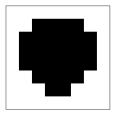




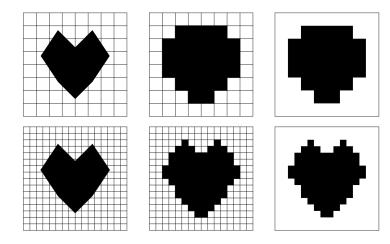


















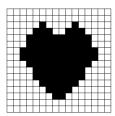








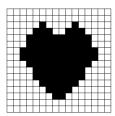


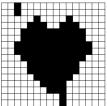




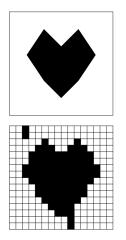




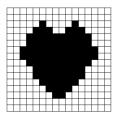


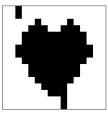














## Example: $C = \{0, 1\}$



Message 'white' or 'black'





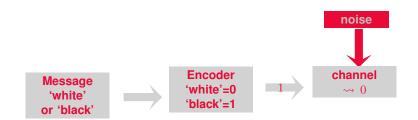




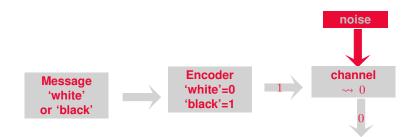




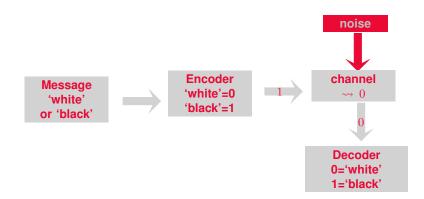




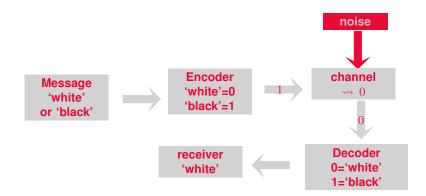














## **Example:** $C = \{00, 11\}$



Message 'white' or 'black'





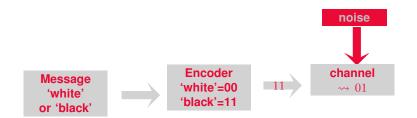




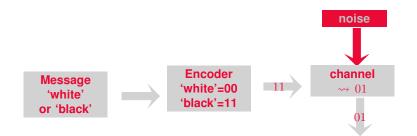




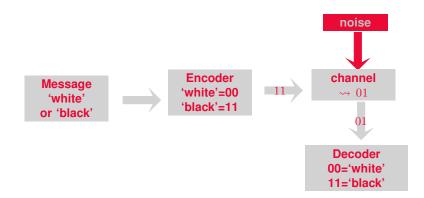




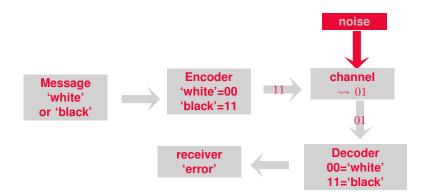














## Example: $C = \{000, 111\}$



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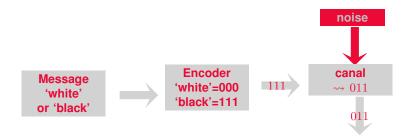




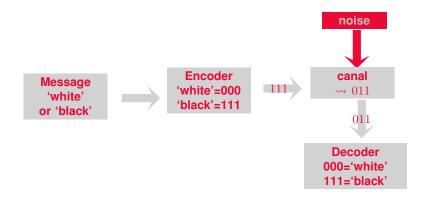




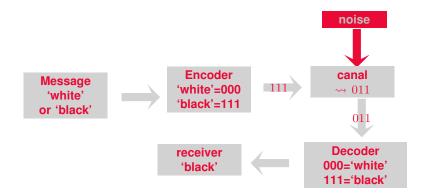
















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■ A (*n*, *M*)-code *C* over a finite set *A* is a subset of *A*<sup>*n*</sup> with M elements. *A* is called the alfabet.



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For 
$$a = (a_1, a_2, ..., a_n)$$
 and  $b = (b_1, b_2, ..., b_n) \in \mathbb{F}_q^n$  let

$$d(a,b) = |\{i : 1 \le i \le n, a_i \ne b_i\}|.$$



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For example

d((00000),(01010))=2

and

$$w((00000)) = 0$$
 y  $w((01010)) = 2.$ 



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**Obs.:** The Hamming distance is a metric on  $\mathbb{F}_q^n$ .





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 $C = \{(000000), (0001111), (0010101), (0011010), (0100110), (0101001), (0110011), (011100), (1000011), (1001100), (1010110), (1011001), (101000), (1111111)\}.$ 

is an (7, 16, 3) binary code.



# A measure for the error-correcting capability of a linear code is the minimum distance



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#### Theorem

A code C with minimum distance d can:

- (i) detect up to d-1 errors;
- (ii) correct up to  $\lfloor \frac{d-1}{2} \rfloor$  errors.



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## Proof

(i) Assume that a codeword x is sent and a vector y is received with up to d-1 errors. Then y can not be a codeword because the minimum distance of C is d and

$$d(x, y) \le d - 1 < d(\mathcal{C}).$$

Thus, the transmission errors has been detected.



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(ii) Let  $t = \lfloor \frac{d-1}{2} \rfloor$  and assume that a codeword x is sent and a vector y is received with up to t errors. Then  $d(x, y) \le t$ .



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(ii) Let  $t = \lfloor \frac{d-1}{2} \rfloor$  and assume that a codeword x is sent and a vector y is received with up to t errors. Then  $d(x, y) \le t$ . If z is another codeword, since

$$d(x,z) \le d(x,y) + d(y,z)$$

then

$$d(y,z) \geq d(x,z) - d(x,y) \geq d-t > t$$

and therefore x is the closest codeword to y.

FIQ UNL • FACULTAD DE INGENIERÍA QUÍMICA To decode y as the codeword x such that d(y,x) is the minimum possible we have to assure that:

each symbol has the same probability p of been transmitted with an error;

if a symbol is received with an error, all of the remaining symbols have the same probability to appear as the error.





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- Each codeword of *C* has *k* information symbols and *n*−*k* redundant symbols: *k*/*n* is called the information rate of the code *C*.



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- Each codeword of *C* has *k* information symbols and *n*−*k* redundant symbols: *k*/*n* is called the information rate of the code *C*.
- One of the main goals of the theory of error correcting codes is to construct *good codes*, i.e., codes with good parameters, maximizing k/n and d/n.

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In general is hard to obtain non trivial lower bounds for a minimum distance of a given code or a given class of codes.



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Every  $a \in E$  has weight  $w(a) \leq d-1$ , hence  $E \cap C = \emptyset$ . As dim E = d-1 we obtain

 $k + (d-1) = \dim \mathcal{C} + \dim E = \dim (\mathcal{C} + E) + \dim (\mathcal{C} \cap E) = \dim (E + \mathcal{C}) \le n.$ 



## Generator matrix of a code ${\mathcal C}$



If B = {v<sub>1</sub>,..., v<sub>k</sub>} is a basis of an [n, k] code C, we define the generator matrix G of the code as the matrix G<sub>k×n</sub> for which the rows are the vectors v<sub>i</sub> of the base.



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■ *G* depend on the basis.

- Two equivalent matrixes define the same code.
- We shall say that *G* is in standard form (often called reduced echelon form) if

$$G = (I_k|A)$$

where  $I_k$  is the  $k \times k$  identity matrix and A is  $k \times n - k$ .





For an [n, k] code C over  $\mathbb{F}_q$  we can encode using the generator matrix G:

$$\begin{array}{cccc} \mathbb{F}_q^k & \longrightarrow & \mathbb{F}_q^n \\ u & \rightarrow & c = uG \end{array}$$



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If  ${\boldsymbol{G}}$  is on standard form then decoding is trivial since

$$u \in \mathbb{F}_q^k \longrightarrow c = uG = (u|uA) \in \mathbb{F}_q^n \longrightarrow u = c_{|_{\mathbb{F}_q^k}} \in \mathbb{F}_q^k.$$

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