## The Third Claude E. Shannon

 Memorial Lecture April 29, 2005

## Are There Turbo-Codes on Mars?



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"The fundamental problem of communication is that of reproducing at one point either exactly or approximately a message selected at another point."

To solve this problem, Shannon created a branch of applied mathematics which is today called Information Theory...

## Information Theory 1101

## Entropy

Entropy $H(X)$ measures our uncertainty about the event X .

$$
H(X)=-\sum_{x} p(x) \log p(x)
$$

Relative entropy $H(X \mid Y)$ measures our uncertainty about X after Y is observed
$H(X \mid Y)=-\sum_{x, y} p(x, y) \log p(x \mid y)$

## Mutual Information

## Mutual Information $I(X ; Y)$ measures

 the amount of information the event $Y$ provides about the event X$$
I(X ; Y)=H(X)-H(X \mid Y)
$$

## Channel Capacity

## The capacity $C$ of a channel is the

 highest possible rate (in bits per second) at which reliable communication over the channel is possible$$
C=\max _{X} I(X ; Y)
$$

## Compressibility

The Compressibility Function $R(\delta)$ is the minimum number of bits per second required to communicate the source output with "distortion" $\delta$.

$$
R(\delta)=\min _{Y:|X-Y| \leq \delta} I(X ; Y)
$$

## Shannon's Equations

$$
\begin{aligned}
H(X) & =-\sum p(x) \log p(x) \\
I(X ; Y) & =H(X)-H(X \mid Y) \\
C & =\max _{X} I(X ; Y) \\
R(\delta) & =\min _{Y} I(X ; Y)
\end{aligned}
$$

## Dr. Shannon's Prescription for Excellent Communications



Channel Coding (Error Correction)
Source Coding (Data Compression)

## Summary

- Of the 35 patterns of three erasures:

25 are correctable with the simple algorithm
3 more are correctable with the complex algorithm
7 are uncorrectable (codewords)




## In a Hamming Code of Length n :



Theorem 1. The number of erasure patterns of weight 3 is $\sim \frac{1}{6} n^{3}$.

Theorem 2. The number of [easily] correctable erasure patterns of weight 3 is $\sim \frac{1}{6} n^{\log _{2} 5}=\frac{1}{6} n^{2.322}$.

Theorem 3. The number of uncorrectable erasure patterns of weight 3 is $\sim \frac{1}{6} n^{2}$.

## Visit To A Small Red Planet

# "The fundamental problem of communication is that 

 of reproducing at one point either exactly or approximately a message selected at another point."Mars


Point A

Earth


Point B

## Example: Mariner 4 (1965)

- $\mathrm{F}=2.3 \mathrm{GHz}$ (S-band)
- BPSK modulation
- $\mathrm{R}=8.33$ bits per second
- No Error Correction
- No Data Compression


This is our baseline system.

## Mariner 4

## The First Close-Up of Mars!



## Mariner 4

## Before and After



## Mariner 4

## A Memento of Mariner 4



## Mariner 4

## Another Mariner 4 Picture



Simulated view through a telescope of Mars from Earth


Earth to Mars distance: 259 million km

Date: 7 February 2003


## Normalized Rate R*

We normalize the data rate R to $\mathrm{R}^{*}$, the rate in image-bits/sec to account for the distance to Mars and a few other factors.

## Viking Mars Orbiters/ Landers (1976)

- $\mathrm{F}=2.3 \mathrm{GHz}$ (S-band)
- BPSK Modulation
- $\mathrm{R}^{*}=3 \mathrm{~K}$ ibps
- $(32,6)$ Biorthogonal Code
- No compression

Viking Lander

## Viking I Landscape



Viking Orbiter

## The Great Equatorial Canyon



## A 20-Year Gap and Then:

## Mars Global Surveyor (1997)

- $\mathrm{F}=8.4 \mathrm{GHz}$ (X - band)
- BPSK Modulation
- $\mathrm{R}^{*}=128 \mathrm{~K}$ ibps
- $(7,1 / 2) \mathrm{CC}+(255,223) \mathrm{RS}$
- 2:1 lossless Rice compression



## "Voyager" (7, 1/2) Convolutional Encoder



## Reed-Solomon Codes



Mr. Reed


Mr. Solomon

## $M G S$


$M G S$

## The "Face" on Mars (Cydonia)



## Earth and Moon from MGS



## Mars Pathfinder (1997)

- $\mathrm{F}=8.4 \mathrm{GHz}(\mathrm{X}-\mathrm{Band})$
- BPSK Modulation
- $\mathrm{R}^{*}=8 \mathrm{~K}$ ibps
- $(15,1 / 6) \mathrm{CC}+(255,223) \mathrm{RS}$
- 6:1 lossy JPEG compression



## "Galileo" (15, 1/6) Convolutional Encoder



## Pathfinder

## "Sojourner"



Simulated view through a telescope of Mars from Earth


Earth to Mars distance: 259 million km

Date: 7 February 2003


## Mars Exploration Rovers (2004)

- $\mathrm{F}=8.4 \mathrm{GHz}$ (X -Band)
- BPSK Modulation
- $\mathrm{R}^{*}=168 \mathrm{~K}$ ibps
- $(15,1 / 6) \mathrm{CC}+(255,223) \mathrm{RS}$
- 12:1 lossy "ICER" compression



## Leaving the Lander



## The "Columbia Hills" (Spirit)

## HUSBAND HILL

## WEST SPUR

## MER

## Eagle Crater (Opportunity)



Example of composite Pancam image

## Progress, 1965-2004

- 1965 (Mariner 4): $\mathrm{R}^{*}=8.33 \mathrm{ibps}$ - 2004 (MER): R*= 168K ibps
- This is a 20000-fold increase, or 4.3 orders of magnitude ( 43 dB ).


## Clash of the Titans

# Newton vs. Shannon 



- Newton (Physics)
- Aperture
- Frequency
- Power

- Shannon (Mathematics)
- Error-Correction
- Data Compression


### 4.3 Orders of Magnitude Improvement in Image Bit Rate, 1965-2004



A Look at the Future


## "Turbo Codes" (1993)

## Claude Berrou

## Alain Glavieux

Turbo Convolutional Encoder / Verify / Decoder System Architecture


## Newton Fights Back with More Aperature

## Green Bank 100m Antenna



## Array of 12m Antennas



## MRO

## Mars Reconnaissance Orbiter (2006)

- $\mathbf{F}=\mathbf{3 2} \mathbf{~ G H z}$ (Ka - Band)
- QPSK Modulation
- $\mathrm{R}^{*}=\mathbf{6 M}$ ibps
- $(8920,1 / 6)$ CCSDS turbo code
- 2:1 lossless compression $\because$



## Was It Worth the Effort?


"Frequently the messages have meaning"

A Tour of the Solar System.

# A Tour of the Solar System. 

Ludwig van Beethoven, Moonlight Sonata Daniel Barenboim, pianist

UCSD
April 29, 2005


## Mercury <br> Mariner 10 <br> 1974

## Venus <br> Magellan <br> 1990

## The Far Side of the Moon <br> Apollo 16 1972

Mars
Mars Global Surveyor 1997

Sunset on Mars
Viking Lander
1976

## The Asteroid Gaspra

Galileo
1991


Jupiter
Voyager 1
1979

## Jupiter's moon lo

 Galileo1996

## lo and Jupiter <br> Cassini <br> 2004

## Jupiter's moon Europa



Galileo 2000

Jupiter's moon Callisto
Galileo
2001


Saturn
Cassini
2004

## Saturn's moon Titan

Cassini
2004

Saturn's moon Phoebe
Cassini


## Uranus <br> Voyager 2 1986

Neptune
Voyager 2 1989

## Pluto and its moon Charon <br> Hubble Space Telescope 1994

## Earth and Moon <br> Apollo 8 1968

We shall not cease from exploration
And the end of all our exploring
Will be to arrive where we started
And know the place for the first time.
-T. S. Eliot, Little Gidding.


