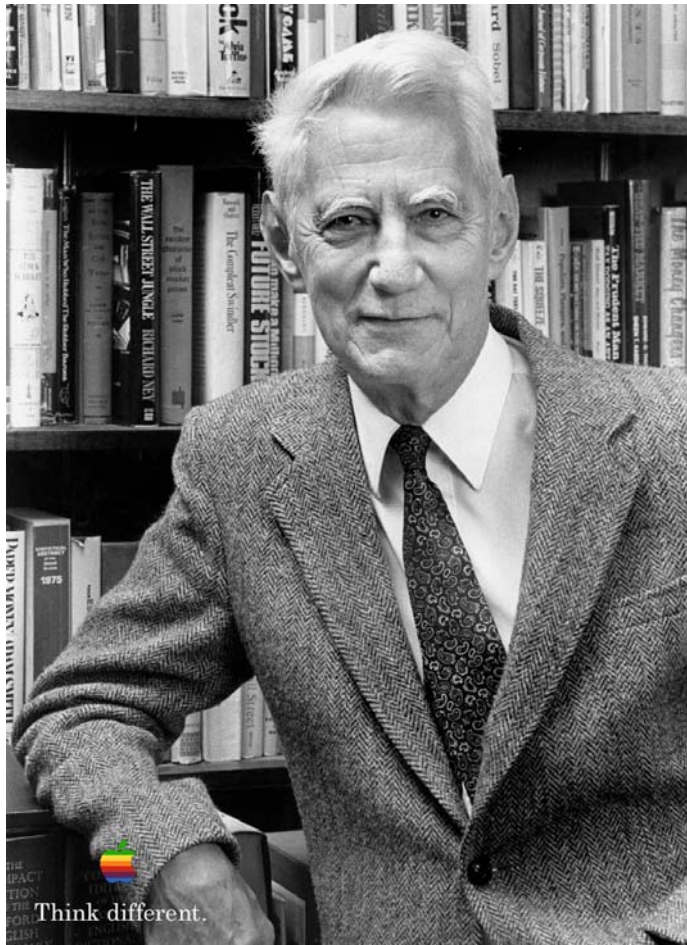




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## Informationstheorie

Claude Shannon 1916-2001



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- **Signal**
- **Nachricht**
- **Information**



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## Signal

- analog
- digital



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## Nachricht

- **Sprache**
- **Syntax**
- **Semantik**



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## Syntax

- **Alphabet**
- **Code**



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## Beispiele für Alphabete:

{ a | b | c | ... | z }

{ α | β | γ | ... | ω }

{ 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 }

{ ♀ | ♂ | ♀ | ♂ | ♀ | ♂ | ♀ | ♂ | ♀ | ♂ | ♀ | ♂ }

{ ♣ | ♦ | ♥ | ♠ }

{ ♀ | ♀ }

{ 🔒 | 🔓 }

{ + | - }

{ ∅ | 1 }



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## Binärcode

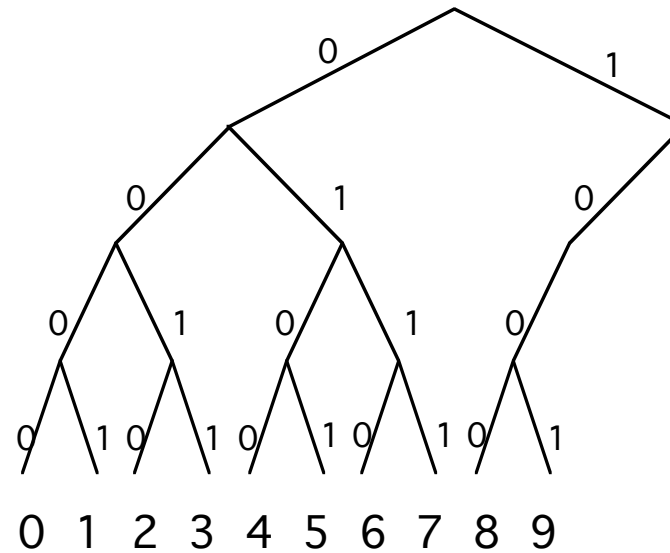
<b>0</b>	<b>0000</b>
<b>1</b>	<b>0001</b>
<b>2</b>	<b>0010</b>
<b>3</b>	<b>0011</b>
<b>4</b>	<b>0100</b>
<b>5</b>	<b>0101</b>
<b>6</b>	<b>0110</b>
<b>7</b>	<b>0111</b>
<b>8</b>	<b>1000</b>
<b>9</b>	<b>1001</b>



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## Codebaum







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$$n = 2^l$$

$$l = \lg n$$

$l$  ... Wortlänge [bit]

$n$  ... Anzahl der Zeichen



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## Informationsgehalt $h(p)$

- unabhängig von der Codierung
- steigt wenn die Wahrscheinlichkeit  $p$  sinkt
- $h(p_1 * p_2) = h(p_1) + h(p_2)$
- $h(p) = \log_2 (1/p)$  [bit]



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## Beispiele für Informationsgehalt

- $h(1) = 0$  Nachricht wird immer erwartet
- $h(0) = \infty$  Nachricht wird nie erwartet
- $h(0.5) = 1$  Nachricht wird zu 50% erwartet
- $h(0.1) = 3.32$  Informationsgehalt einer Dezimalziffer



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## Logarithmus dualis $\text{ld } x$

- $2^{\text{ld } x} = x$
- $\text{ld } (x \cdot y) = \text{ld } x + \text{ld } y$
- $\text{ld } 2^x = 1 + \text{ld } x$
- $\text{ld } x^2 = 2 \cdot \text{ld } x$
- $\text{ld } x = \ln x / \ln 2 \sim 1.44 \cdot \ln x$
- $\text{ld } x = \log x / \log 2 \sim 3.32 \cdot \log x$



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<b>x</b>	<b>ld x</b>
<b>1</b>	<b>0.00</b>
<b>2</b>	<b>1.00</b>
<b>3</b>	<b>1.58</b>
<b>4</b>	<b>2.00</b>
<b>5</b>	<b>2.32</b>
<b>6</b>	<b>2.58</b>
<b>7</b>	<b>2.81</b>
<b>8</b>	<b>3.00</b>
<b>9</b>	<b>3.17</b>
<b>10</b>	<b>3.32</b>



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**Mittlerer Informationsgehalt  $H = \sum p_i \log_2 1/p_i$  [bit]**

**Mittlere Wortlänge  $L = \sum p_i l_i$  [bit]**

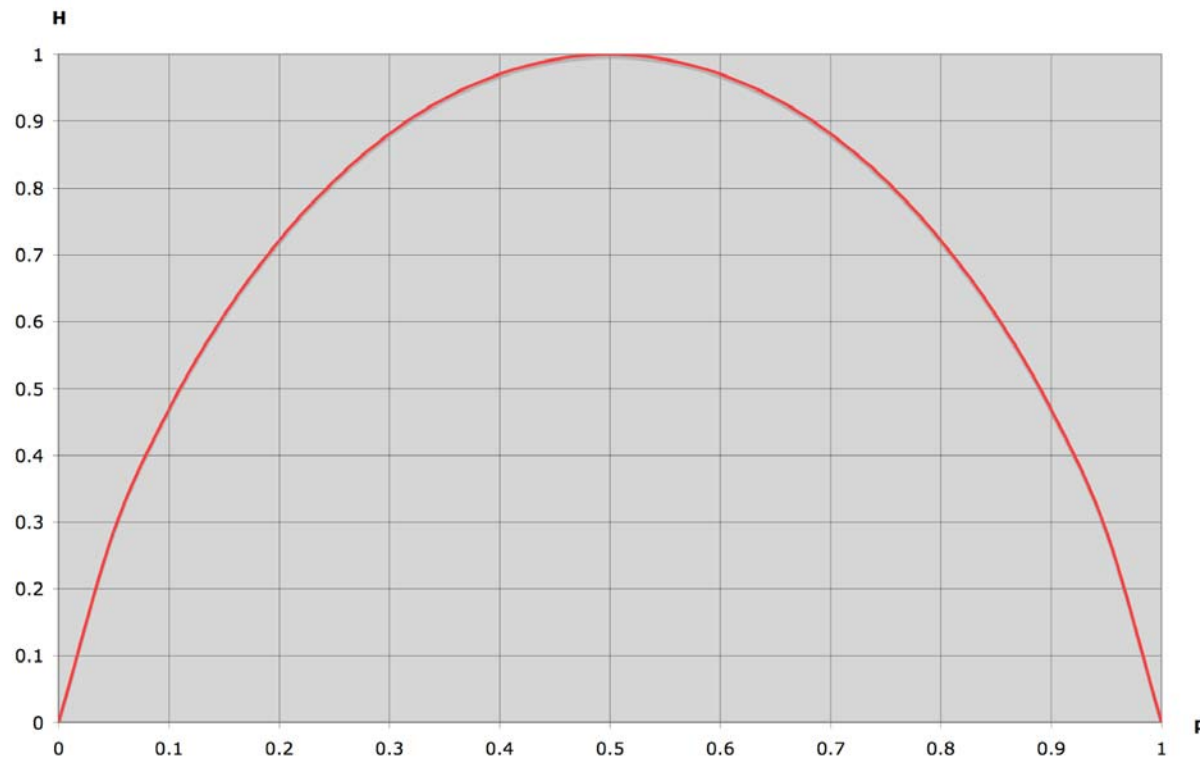
**Redundanz  $R = L - H$  [bit]**



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## Shannon'sche Funktion

$$H = p \lg 1/p + (1-p) \lg 1/(1-p)$$




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## **Redundanz einer Dezimalziffer** **(alle 10 Ziffern gleichwahrscheinlich)**

**Informationsgehalt  $H = \log_2 10 = 3.32$  bit**

**Wortlänge  $L = 4$  bit**

**Redundanz  $R = L - H = 0.68$  bit**





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## Informationsgehalt eines Buchstabens (alle 26 Buchstaben gleichwahrscheinlich)

**Informationsgehalt  $H = \log_2 26 = 4.7$  bit**



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## Informationsgehalt eines Buchstabens (unterschiedliche Wahrscheinlichkeiten einzelner Buchstaben)

**Mittlerer Informationsgehalt  $H = 4.1$  bit**



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## Informationsgehalt eines Buchstabens (unterschiedliche Wahrscheinlichkeiten aufeinanderfolgender Buchstaben)

**Mittlerer Informationsgehalt  $H \sim 2$  bit**



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## **Informationsgehalt eines Wortes** **(10 Millionen Wörter** **mit unterschiedlichen Wahrscheinlichkeiten)**

**Mittlerer Informationsgehalt  $H \sim 11.8$  bit**  
**Mittlere Wortlänge  $L = 5.7$  Buchstaben**



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## Informationsfluss beim Lesen

**25 Buchstaben pro Sekunde  
entspricht 50 bit/s**

**(In 60 Jahren kann ein Mensch etwa  $3 \cdot 10^{10}$  bit  
aufnehmen)**



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**Speicherkapazität des Gehirns  $\sim 10^{12}$  bit**



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**Erbinformation ~  $10^{10}$  bit**