

# Breadth: Compressing Information



Information

Is the enemy coming?

Yes / No

10 torches



Message = number of torches lit



*Enemy is coming*



*We need more food*



*Olaf fell down the well again. LOL.*

...

10 torches in 2 groups



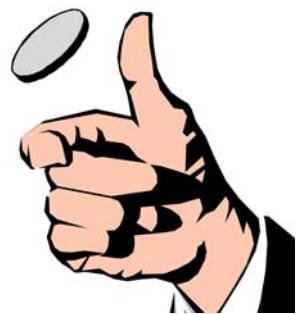
Polybius square

Torches in group 1

	1	2	3	4	5
1	A	B	C	D	E
2	F	G	H	I/J	K
3	L	M	N	O	P
4	Q	R	S	T	U
5	V	W	X	Y	Z

Torches in group 2

A	0.5	0
B	0.5	1



1 bit of information



Yes or No  
questions

*Is it B?*

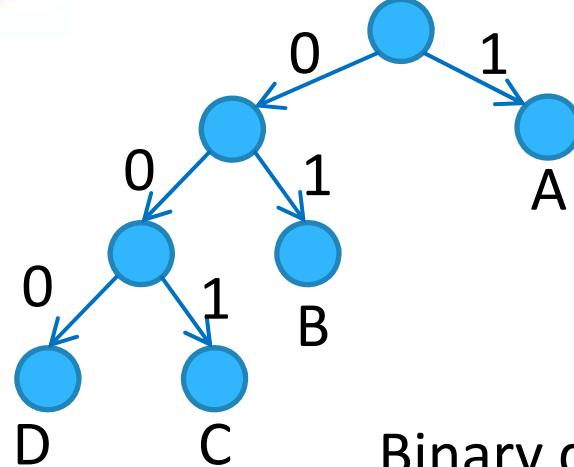
*Is it B?*

A	0.25	1
B	0.25	0 1
C	0.25	0 0 1
D	0.25	0 0 0

*codewords*



Is it A?      0 / 1  
 Is it B?      0 / 1  
 Is it C?      0 / 1



Yes or No  
questions

Binary decision tree

A	0.25	1	1 bit
B	0.25	0 1	2 bits
C	0.25	0 0 1	3 bits
D	0.25	0 0 0	3 bits

Average:  $\sum p \cdot (\#bits) = 2.25 \text{ bits}$



Yes or No  
questions

- A 0.25
- B 0.25
- C 0.25
- D 0.25

Can you come up with a better strategy?

How many bits on average will it use?



- A. 1 bit
- B. 1.5 bits
- C. 1.75 bits
- D. 2 bits
- E. 2.25 bits

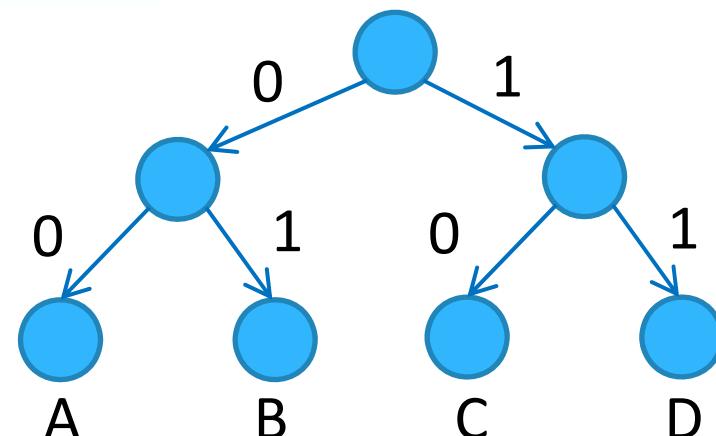
Yes or No questions

A	0.25	0 0	2 bit
B	0.25	0 1	2 bits
C	0.25	1 0	2 bits
D	0.25	1 1	2 bits

Average: 2 bits



Binary  
decision  
tree



Yes or No  
questions

- A 0.5
- B 0.25
- C 0.125
- D 0.125

Can you come up with a good strategy?

How many bits on average will it use?

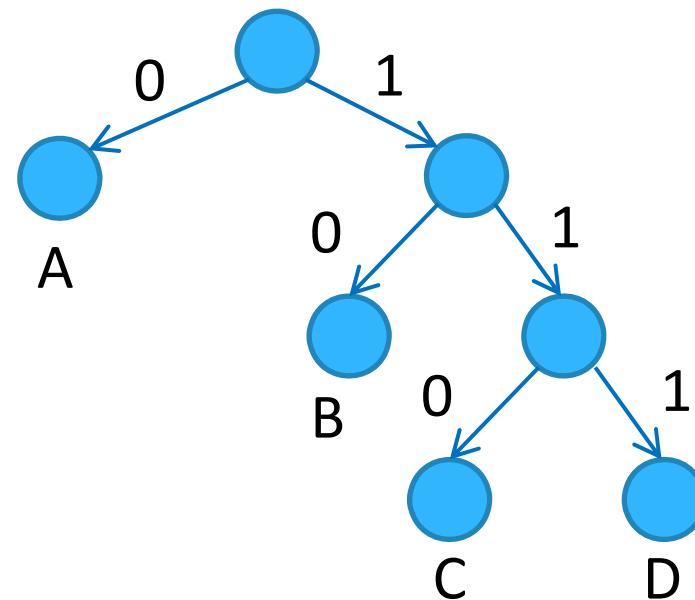


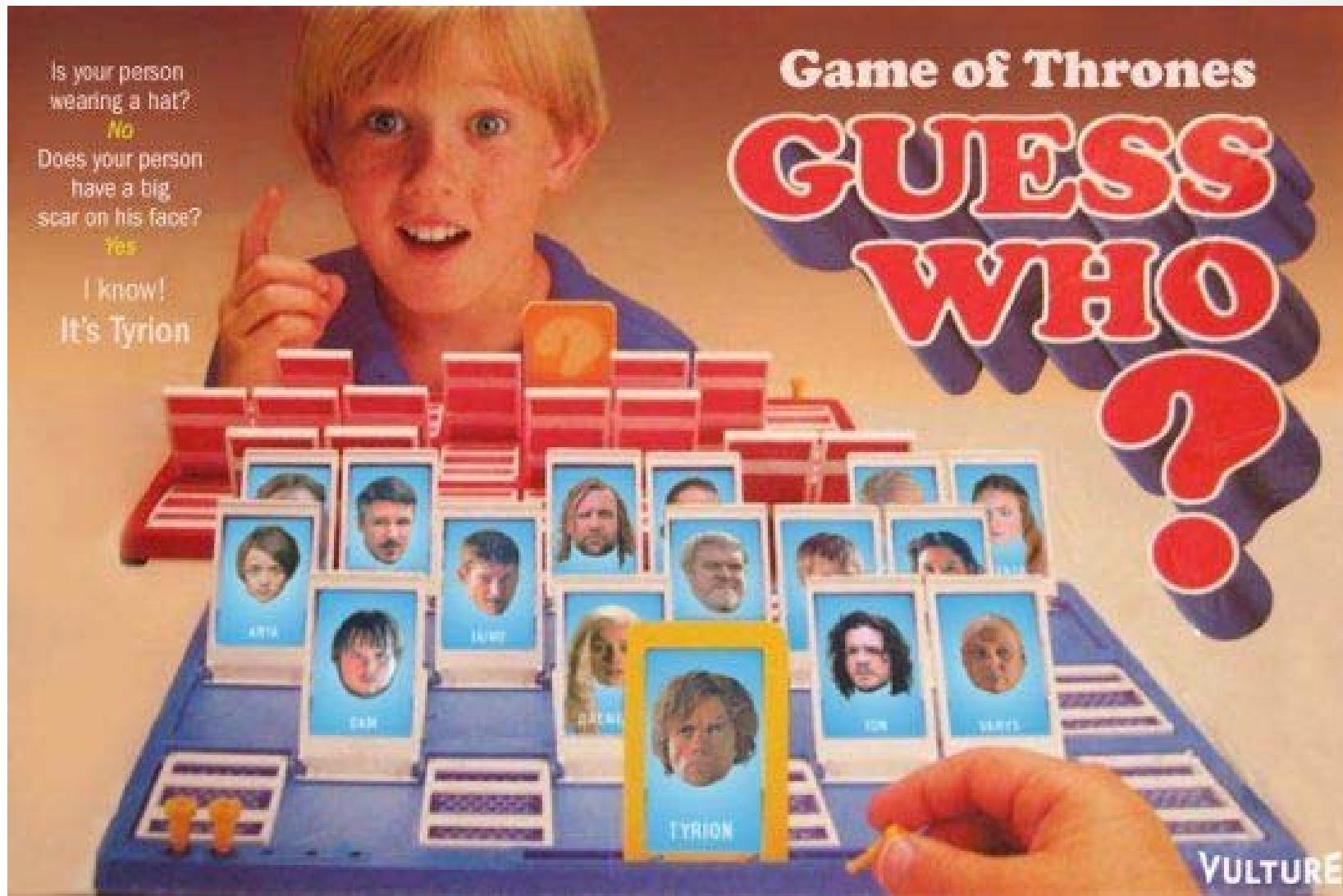
Yes or No questions

- A. 1 bit
- B. 1.5 bits
- C. 1.75 bits
- D. 2 bits
- E. 2.25 bits

A	0.5	0	1 bit
B	0.25	1 0	2 bits
C	0.125	1 1 0	3 bits
D	0.125	1 1 1	3 bits

Average: 1.75 bits





- A 0.4
- B 0.1
- C 0.2
- D 0.3

Can you come up with a good strategy?

How many bits on average will it use?



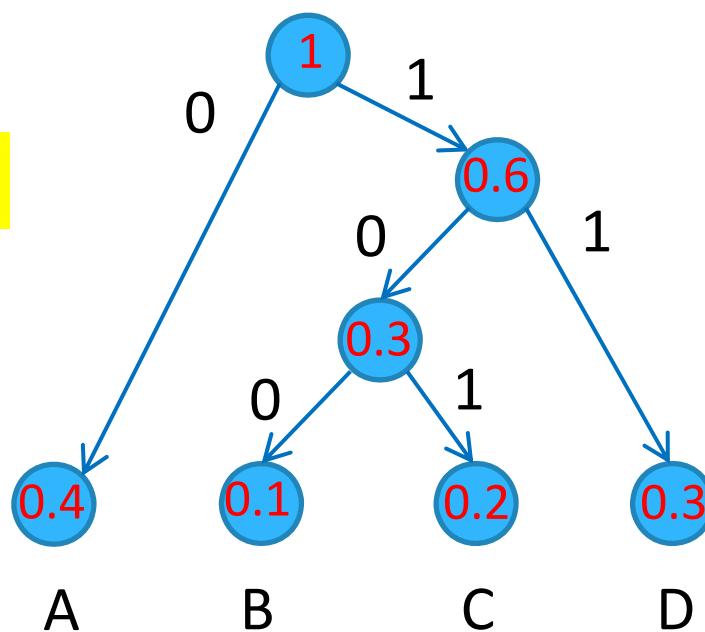
Yes or No questions

- A. ~ 1.7 bit
- B. ~ 1.8 bits
- C. ~ 1.9 bits
- D. ~ 2 bits
- E. ~ 2.1 bits

A	0.4	0	1 bit
B	0.1	1 0 0	3 bits
C	0.2	1 0 1	3 bits
D	0.3	1 1	2 bits

Average: 1.9 bits

### Huffman coding



A	0.4	0
B	0.1	1 0 0
C	0.2	1 0 1
D	0.3	1 1



AABDACACDAAADCAB ...

001011010101110111000111010100 ...

Yes or No  
questions

A	0.05
B	0.05
C	0.15
D	0.2
E	0.2
F	0.35

What is the Huffman code?



Yes or No  
questions

A	0.4	0	0	1 bit
B	0.1	1 0 0	0 1	2 bits
C	0.2	1 0 1	1 0	2 bits
D	0.3	1 1	1	1 bit

Average: 1.9 bits



Average: 1.3 bits



AABDACACDAAADCAB ...

001011010101110111000111010100 ...

0001101001101000110001 ...

Yes or No  
questions

A	0.4	0	1 bit
B	0.1	0 1	2 bits
C	0.2	1 0	2 bits
D	0.3	1	1 bits

Average: 1.3 bits



You receive 0101. What message was sent?

Yes or No  
questions

- |         |        |
|---------|--------|
| A. ADAD | D. ACA |
| B. BB   | E. BC  |
| C. AAC  |        |

A 0.4  
B 0.1  
C 0.2  
D 0.3

0 1 bit  
0 1 2 bits  
1 0 2 bits  
1 1 bits

Average: 1.3 bits



You receive 0/10/1. What message was sent?



Yes or No questions

A C D

## Morse code

A ● -

B - ● ● ●

C - ● - ●

D - ● ●

E ●

F ● ● - ●

G - - ●

H ● ● ● ●

I ● ●

J ● - - -

K - ● -

L ● - ● ●

M - -

N - ●

O - - -

P ● - - ●

Q - - ● -

R ● - ●

S ● ● ●

T -

U ● ● -

V ● ● ● -

W ● - -

X - ● ● -

Y - ● - -

Z - - - ●

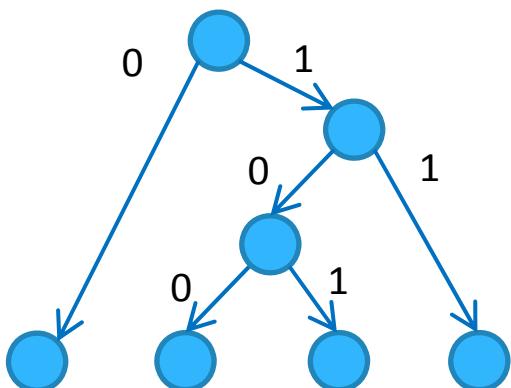
Prefix code

E.g. Huffman code

Non-prefix code

E.g. Morse code

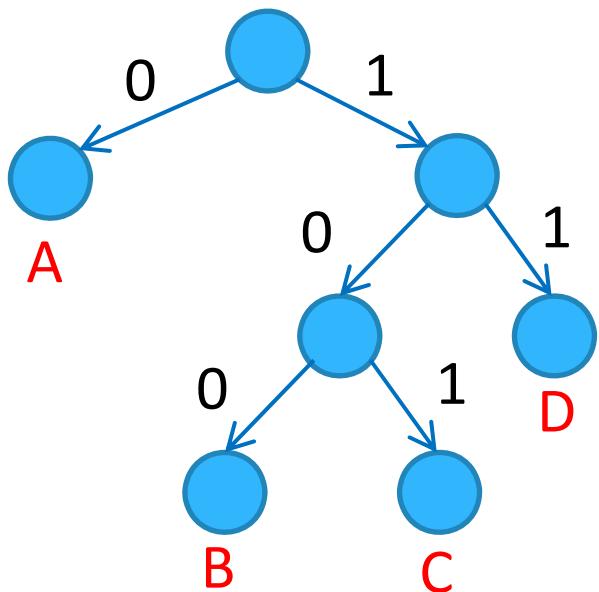
Binary tree



001011010101110111000111010100 ...

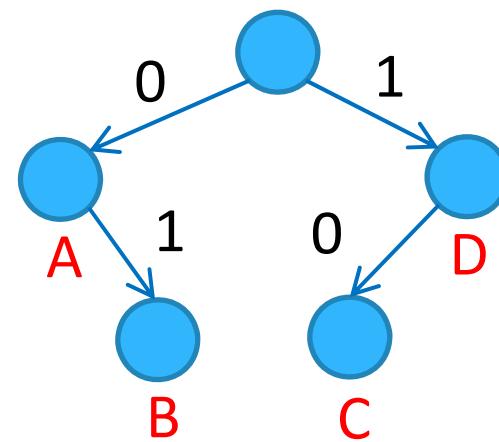
Prefix code

A	0
B	1 0 0
C	1 0 1
D	1 1



Non-prefix code

A	0
B	0 1
C	1 0
D	1



## Morse code

A ● -	J ● ---	S ● ● ●
B - ● ● ●	K - ● -	T -
C - ● - ●	L ● - ● ●	U ● ● -
D - ● ●	M --	V ● ● ● -
E ●	N - ●	W ● - -
F ● ● - ●	O ---	X - ● ● -
G - - ●	P ● - - ●	Y - ● - -
H ● ● ● ●	Q - - - ●	Z - - ● ●
I ● ●	R ● - ●	

At what price and how soon can you furnish?" ..... Quadrants

### Telegraph Code

In writing a cipher message, please observe the following:  
First—Begin every cipher word with a capital letter.

Second—Whenever a blank occurs in a sentence, the word or words supplying such blank must immediately follow the cipher word of the sentence.

#### Quotations and Correspondence

	Cipher Word
At what price and how soon can you furnish	Quadrants
Quote best price on	Quadrant
In market for	Quadrangle
Quote best price on square feet of standard	Quadrille
(38-inch) height of Radiators	Quadrone
Wire reply quickly	Quadruped
Will wire you to-morrow morning	Quaffed
Have written	Quaggy
Must have information immediately	Quablog
Answer by first mail	Quagmire
See our letter of giving full particulars	Quaintly
Have received no reply from you to our letter of	Quakingly
Referring to your telegram of	Quakerism
Referring to your letter of	Quality
Have received no reply to our telegram of	Quamodit
Referring to our telegram of	Quandary
Referring to our letter of	Quarried
Referring to telephone conversation of to-day	Queremess
Do not understand the meaning of	Quartette
Inclosure mentioned in your letter of not received, mail same at once	Quarium
We quote you for immediate acceptance	Quash
F. O. B. factory less the actual rate of freight in carloads or less to any railroad point of destination not to exceed 30¢ per 100 lbs	Quaternion
Wire at once less than carload freight rate on	Quaternary
Answering your wire of date less than carload rate per cwt. on	Quaternate
Wire carload freight rate on	Quartzite
Answering your wire of date the carload rate per cwt. and minimum weight on	Quaternity
Change my route to read as follows	Quaster
Will be here until	Quazarcho
Will be in	Quazibith
Immediate specifications three months delivery	Quazitance

3 per cent	Quidslim
7½ per cent	Quiliture
10 per cent	Quittance

A	$1/4$	0
B	$3/4$	1

What is the Huffman code?



1 bit / symbol



Yes or No  
questions

Can we do better?

A	1/4
B	3/4

AA	1/16	0 0 0	3 bits
AB	3/16	0 0 1	3 bits
BA	3/16	0 1	2 bits
BB	9/16	1	1 bits

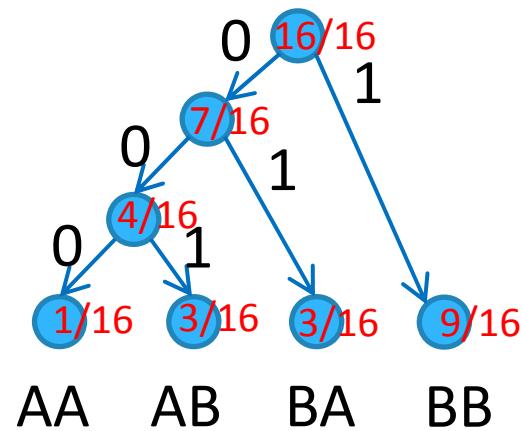
Average: 1.6875 bits



0.8438 bits / symbol



*We are only  
considering  
independent  
events!*



Yes or No  
questions

A	$1/4$	AAA	$1/64$	000000	6 bits
B	$3/4$	AAB	$3/64$	000001	6 bits
		ABA	$3/64$	00001	5 bits
		ABB	$9/64$	010	3 bits
		BAA	$3/64$	0001	4 bits
		BAB	$9/64$	011	3 bits
		BBA	$9/64$	001	3 bits
		BBB	$27/64$	1	1 bit

Average: 2.4844 bits

0.8281 bits / symbol

Grouping of 1 symbol

1 bit/symbol

Grouping of 2 symbols

0.8438 bits/symbol

Grouping of 3 symbols

0.8281 bits/symbol

...

Grouping of  $\infty$  symbols

?? bits/symbol

< 0.8113 bits/symbol

A      1/4  
B      3/4

$$I = \frac{1}{4} \cdot \log_2 \frac{4}{1} + \frac{3}{4} \cdot \log_2 \frac{4}{3}$$

$$= 0.8113 \text{ bits/symbol}$$

## Entropy

$$I = \sum p \cdot \log_2 \frac{1}{p}$$

$$= - \sum p \cdot \log_2 p$$

Claude Shannon



Claude Shannon  
1916 - 2001



A	0.5
B	0.5

$$I = 1$$

A	0.25
B	0.75

$$I = 0.8113$$

A	0
B	1

$$I = 0$$



$$I = - \sum p \cdot \log_2 p$$



Bits

Information relates to *uncertainty*.

*Note: context matters as well*

“Tomorrow, it will be over 55 degrees in La Jolla”

