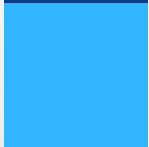


Breadth: Compressing Information





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

Torches in group 2

	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

A	0.5	0
B	0.5	1



1 bit of information



Yes or No
questions

Is it B?

Is it B?

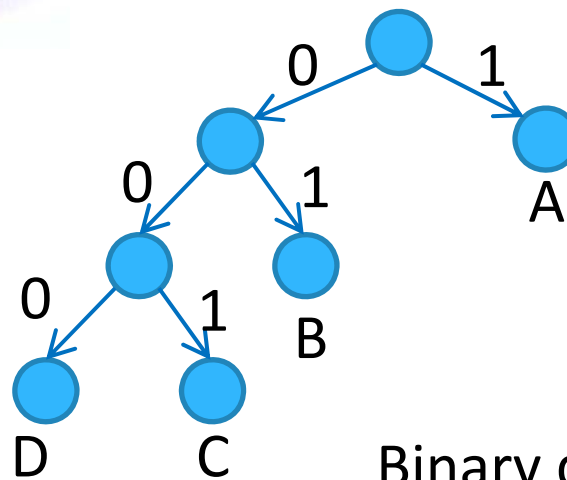
A	0.25	1
B	0.25	0 1
C	0.25	0 0 1
D	0.25	0 0 0

codewords



Yes or No
questions

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



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: $\sum p \cdot (\#bits) = 2.25$ 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?



Yes or No questions

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

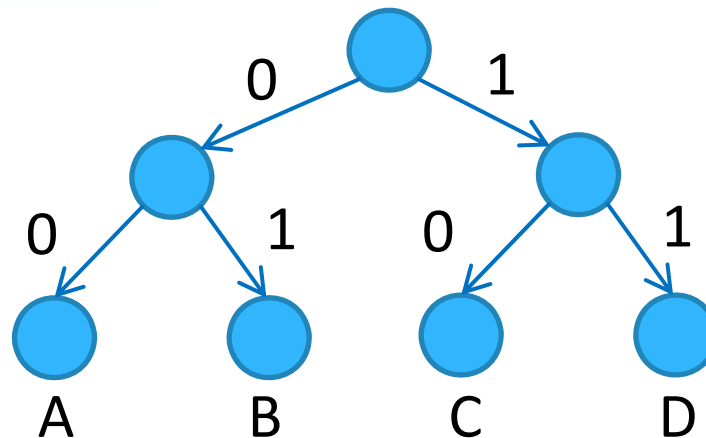
A	0.25	0	0	2 bit
B	0.25	0	1	2 bits
C	0.25	1	0	2 bits
D	0.25	1	1	2 bits

Average: 2 bits



Yes or No questions

Binary decision tree



- 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?

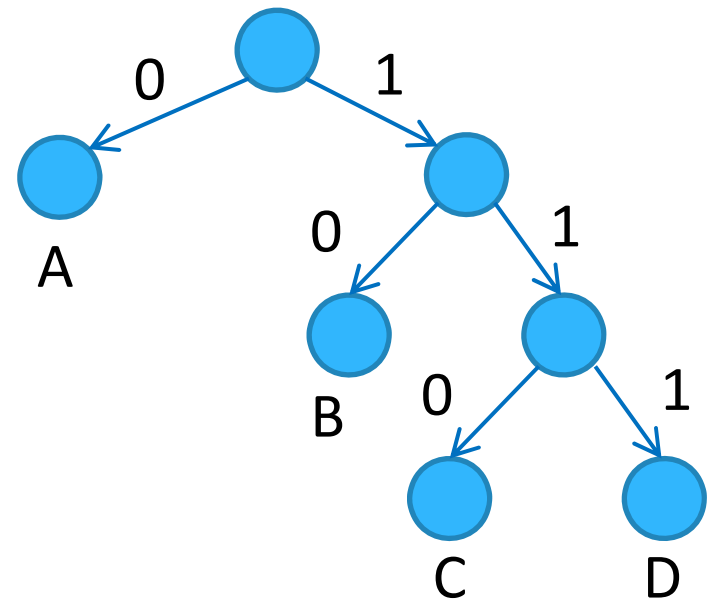


Yes or No questions

- 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



Is your person wearing a hat?

No

Does your person have a big scar on his face?

Yes

I know!
It's Tyrion

Game of Thrones GUESS WHO?



VULTURE

- 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?



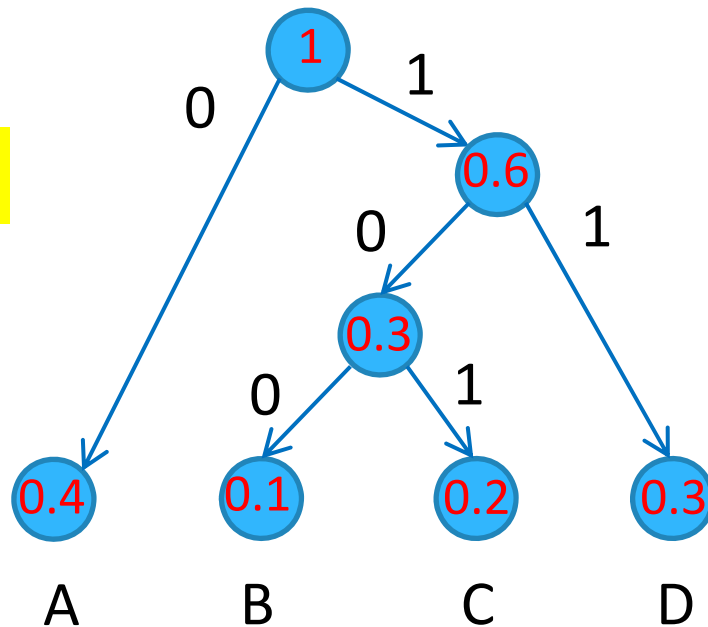
Yes or No questions

- 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	



Yes or No
questions

AABDACADCDAAADCAB ...

001011010101110111000111010100 ...

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



Yes or No questions

AABDACADCDAAADCAB ...

001011010101110111000111010100 ...

0001101001101000110001 ...

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 0101. What message was sent?

Yes or No questions

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

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 - - ● ●

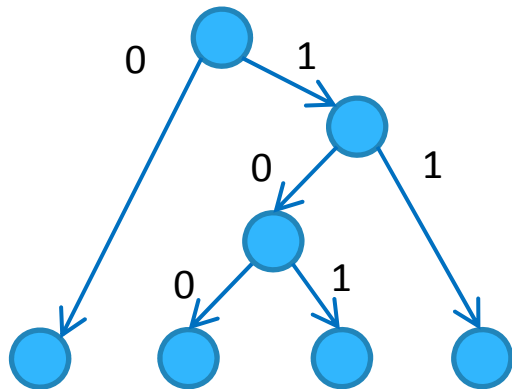
Prefix code

E.g. Huffman code

Non-prefix code

E.g. Morse code

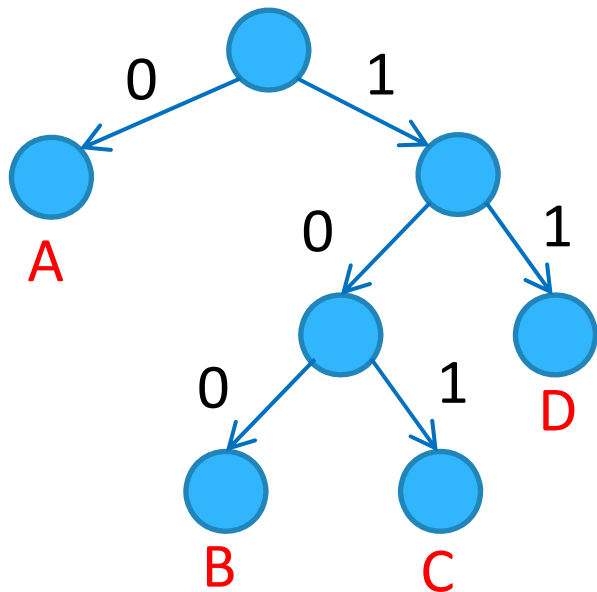
Binary tree



001011010101110111000111010100 ...

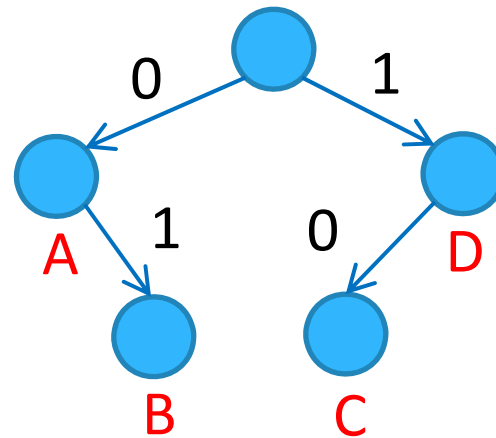
Prefix code

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

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

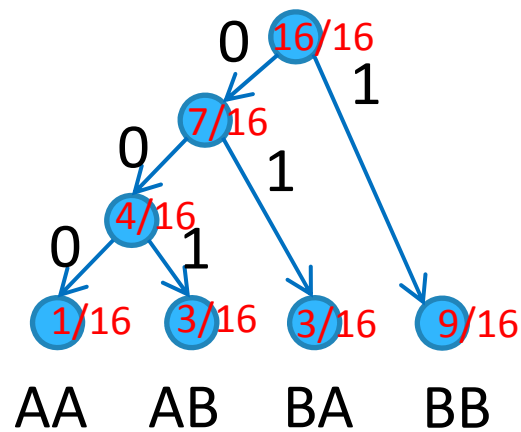


0.8438 bits / symbol



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 ∞ symbols

?? bits/symbol

< 0.8113 bits/symbol

A 1/4
B 3/4

$$I = \frac{1}{4} \cdot \log_2 \frac{4}{1} + \frac{3}{4} \cdot \log_2 \frac{4}{3}$$
$$= 0.8113 \text{ bits/symbol}$$

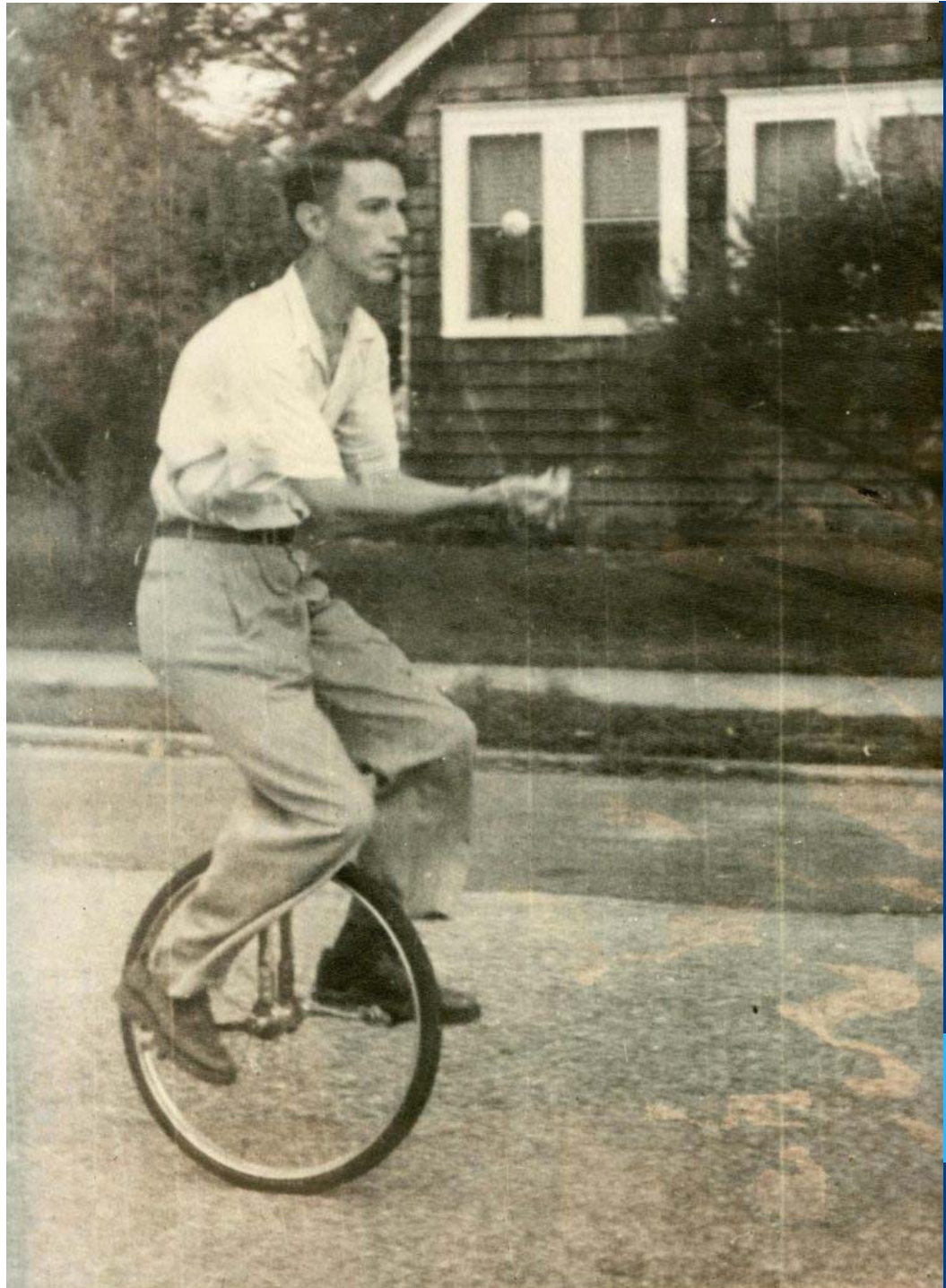
Entropy

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

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”

