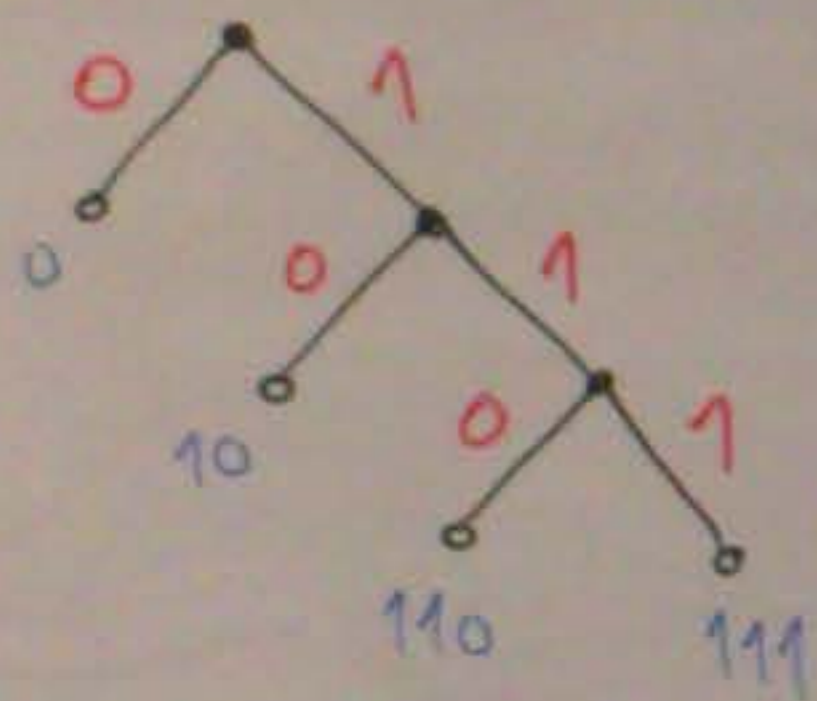


# Huffman coding

- prefix-free code  
symbol length is given a-priori  
(see Kraft inequality)

Ex:  $l_i \in \{1, 2, 3, 3\}$



Q: why  $\{1, 2, 3, 3\}$  and not  $\{2, 2, 2, 2\}$ ?

Q: which source symbol shall be assigned when?

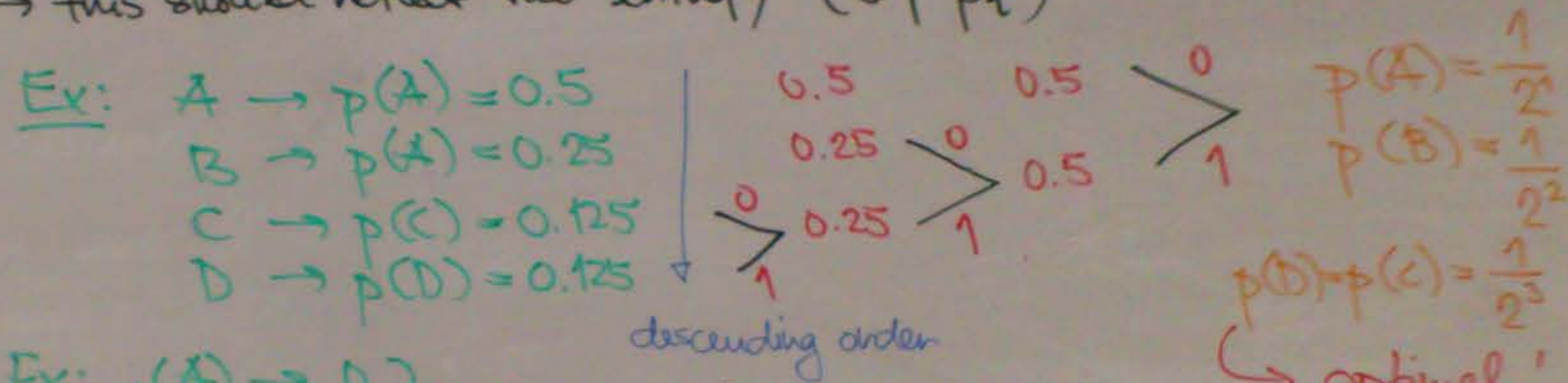
↳ this should reflect the entropy ( $\sigma, p_i$ )

Ex:  $A \rightarrow p(A) = 0.5$

$B \rightarrow p(B) = 0.25$

$C \rightarrow p(C) = 0.125$

$D \rightarrow p(D) = 0.125$

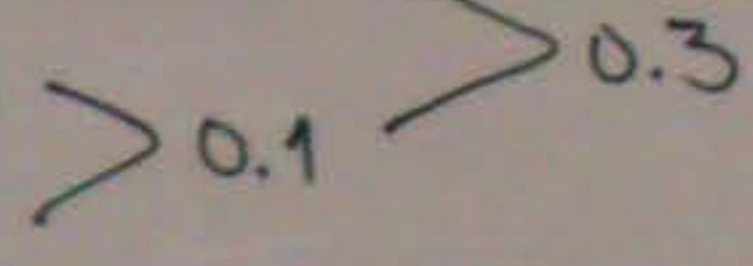


Ex:  $p(A) \rightarrow 0.7$

$p(B) \rightarrow 0.2$

$p(C) \rightarrow 0.09$

$p(D) \rightarrow 0.01$



$p(C) = p(D) = \frac{1}{2^3}$

↳ optimal!

Huff. c. works well  
any for these!!



# Huffman coding

• problems:

a) optimality

b) 2-pass approach

pass #1: determine  $p_i$  (source symbol probabilities)  
pass #2: encode

⇒ adaptive Huffman coding

start with a-priori distribution

and update it on-line

→ re-construction of Huffman tree

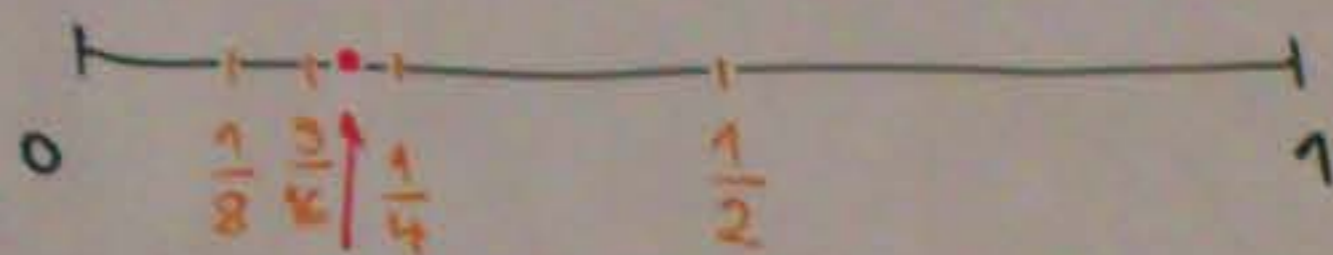
c) it is symbol-based

in English: 'the', 'a', 'is', 'qu'  
are very frequent

# Arithmetic coding

arbitrary precision arithmetic

Idea: Represent the message as a rational number and represent this rational number in binary arithmetic on  $[0,1]$



$$\frac{11}{16} = \frac{1}{2} + \frac{0}{4} + \frac{1}{8} + \frac{1}{16}$$

0.1011

a)  $\frac{a}{b}$  ... a fraction representing the message

$$0.1_2 = 2^{-1} = \frac{1}{2}, \quad 0.01_2 = 2^{-2} = \frac{1}{4}$$

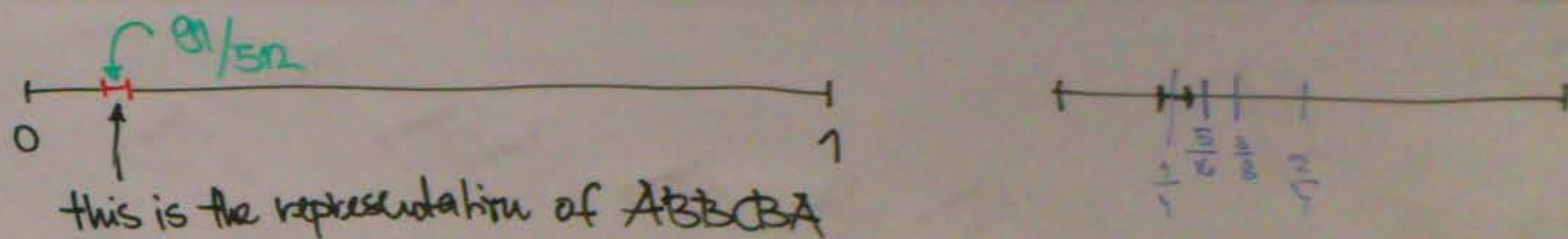
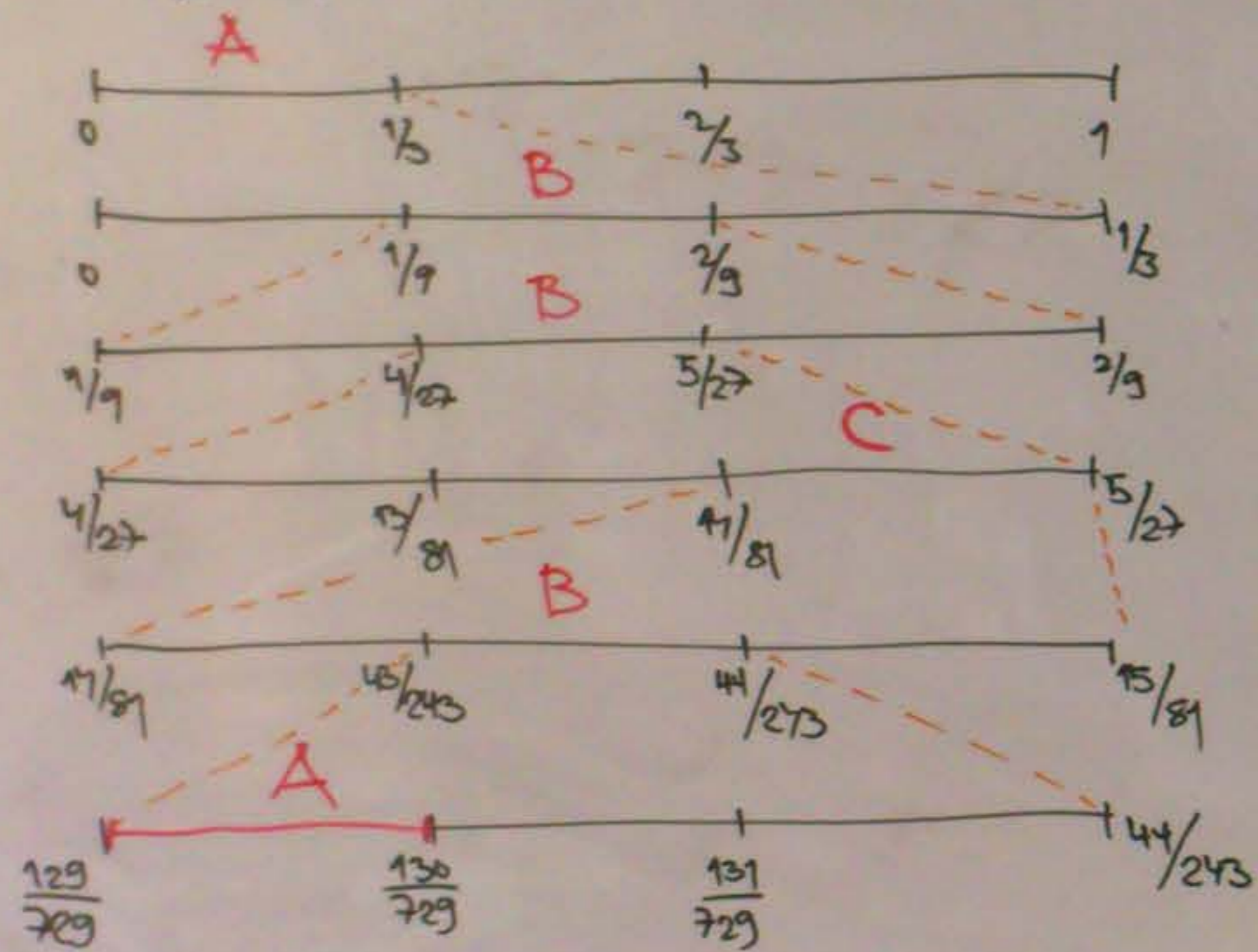
b) look for an interval in  $[0,1]$  where  $\frac{a}{b}$  lies by binary search (bisection)

→ 'bracket' Ex:  $(0.1)_{10} \equiv (0.0001)_2 \in [\frac{1}{16}, \frac{2}{16}]$   
and  $(0.2)_{10} \in [\frac{2}{16}, \frac{3}{16}]$



Ex:  $p(A) = p(B) = p(C) = 1/3$

Arithmetic code for **ABBCCA**



now: find a binary fraction  $\frac{x}{2^k}$  such that

$$\frac{x}{2^k} \in \left( \frac{129}{729}, \frac{130}{729} \right)$$

! the 'shortest' one!



the binary string representing the fraction is the encoded message!

$$\frac{129}{729} = 0.17695 < \frac{x}{2^k} < 0.17832 = \frac{130}{729}$$

$$k=1: \frac{1}{2} > 0.17 \quad \times$$

$$k=2: \frac{1}{4} > 0.17 \quad \times$$

$$k=7: \frac{128}{128} < 0.176, \frac{129}{128} > 0.178 \quad \times$$

$$k=8: \frac{128}{256} < 0.176, \frac{129}{256} > 0.178 \quad \times$$

$$k=9: \frac{91}{512} > 0.176, \frac{91}{512} < 0.178 \quad \checkmark$$

$$\text{binary rep. of } \frac{91}{512} = \frac{1}{8} + \frac{1}{32} + \frac{1}{64} + \frac{1}{256} + \frac{1}{512} \Rightarrow 0.001011011$$