

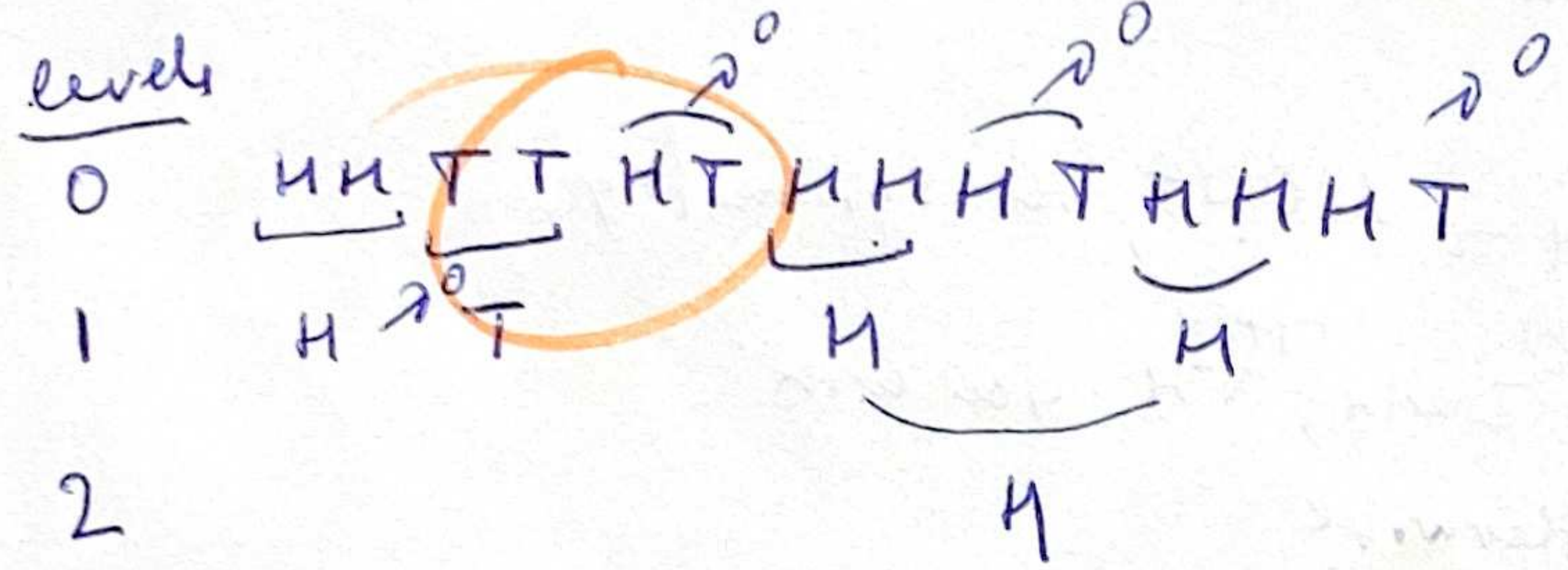
independently

$2^k$  all H or  
all T



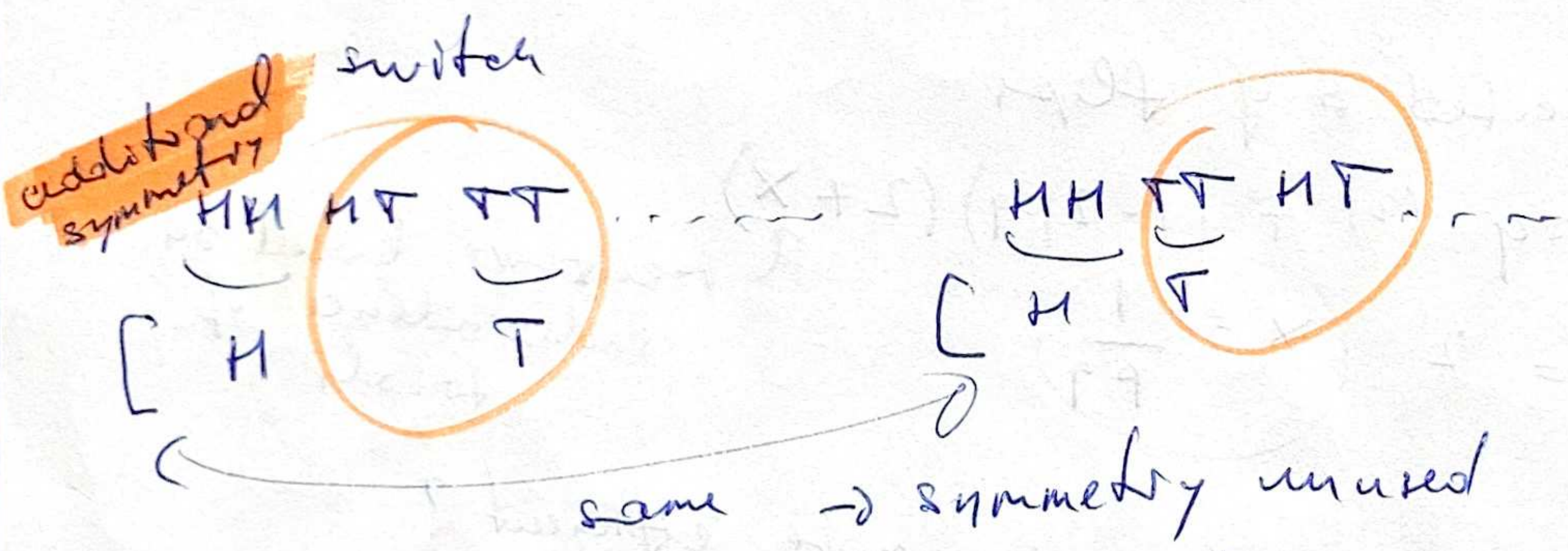
next question: how to get many coin flips? ... efficiently.

extract max # of flips from a string of flips

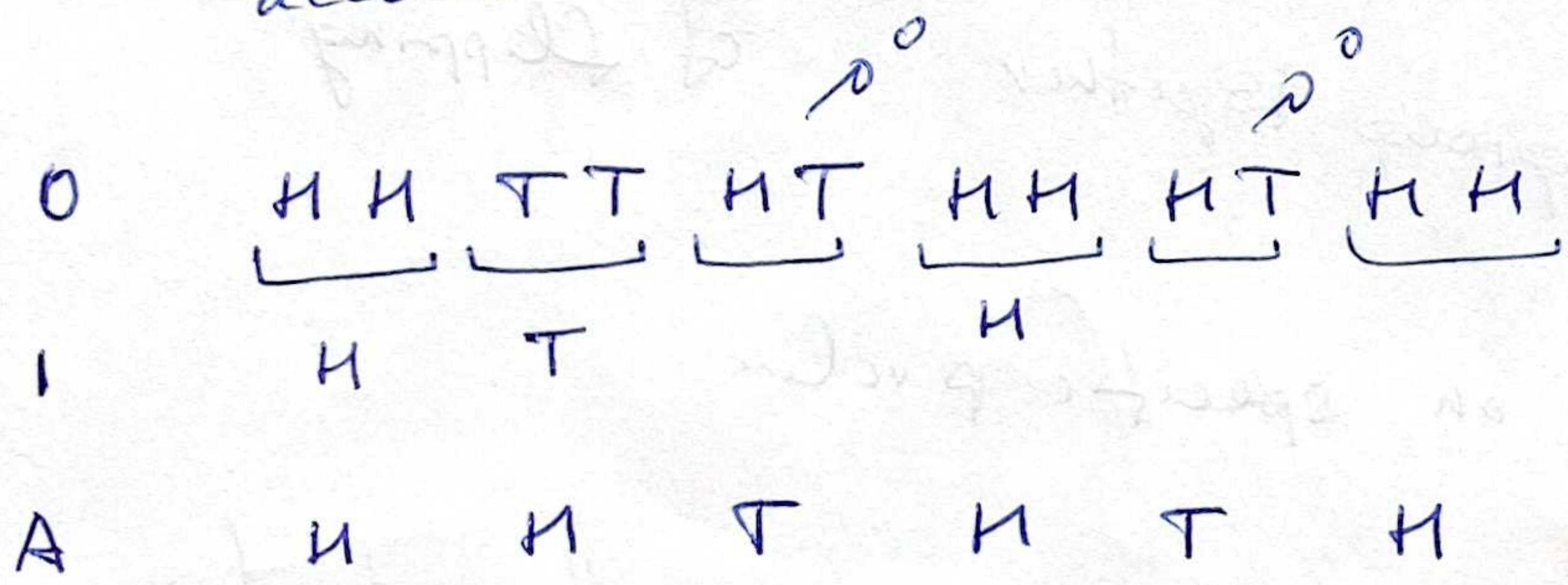


is it all? are we getting all randomness out?  
order flips

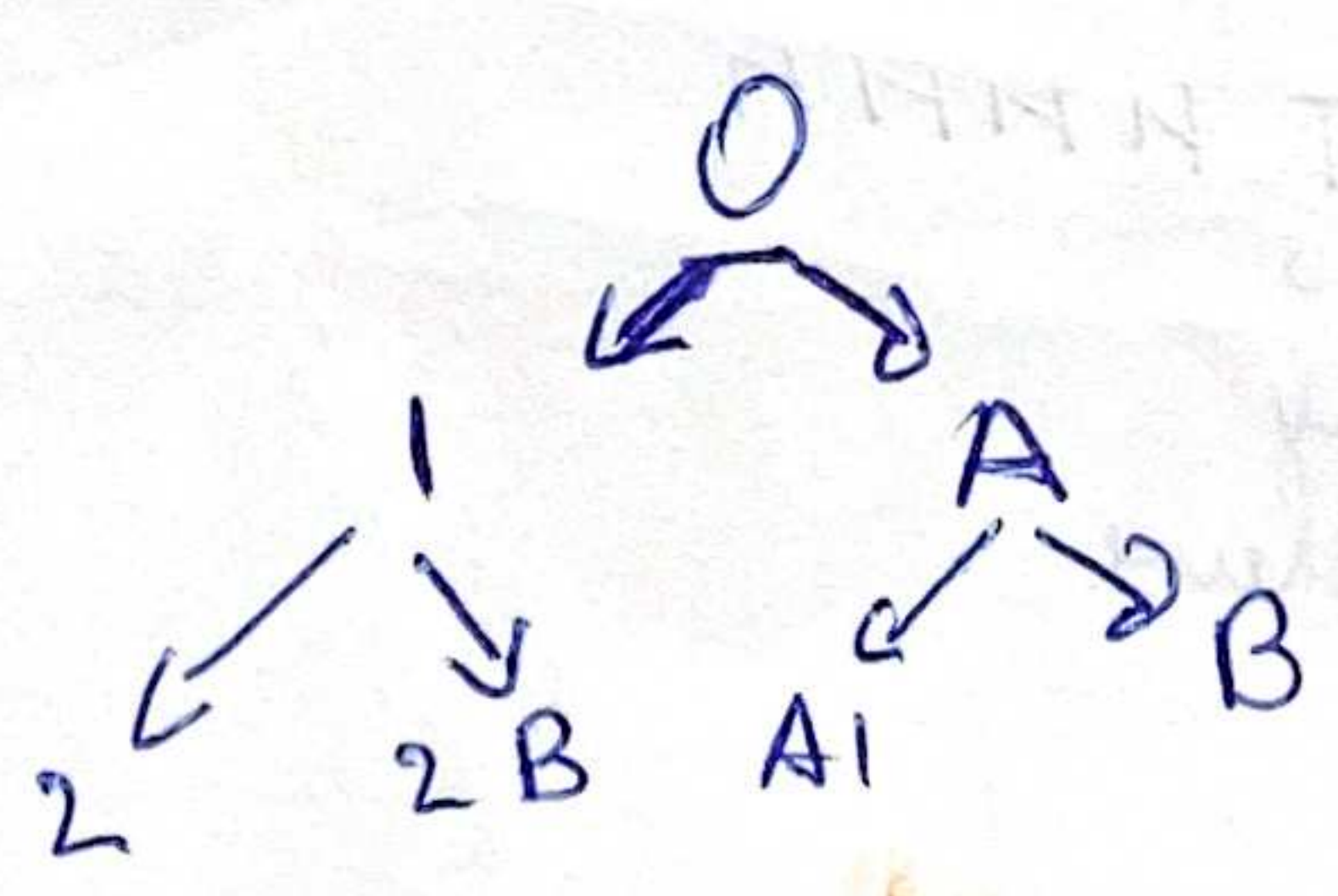
cannot shift by one  $\rightarrow$  not indep!



generate another sequence to take this symmetry into account



H same  
T different



can reconstruct sequence from flips

all unbiased indep coin flips pulled out of a string of biased



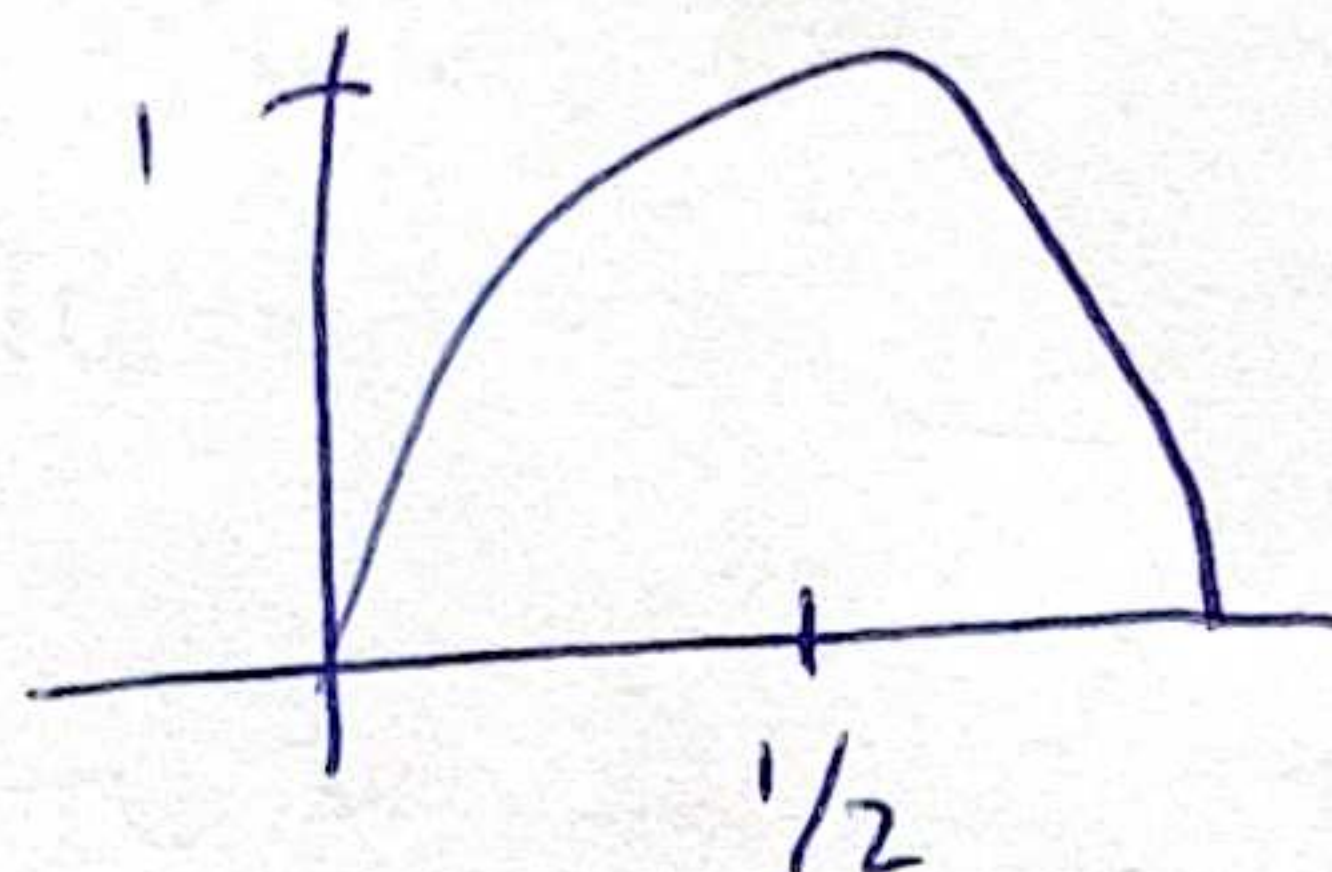
entropy = measure randomness

Biased coin  $p$

$H(p)$  = entropy  $\rightarrow$  average # of bits available per coin flip

$$H(1/2) = 1$$

$\uparrow$   
1 bit per flip



$$H(p) = 0.72$$

$\uparrow$   
0.72 bits per flip

$$H(p) = -p \log_2 p - (1-p) \log_2 (1-p) \quad \text{for coin flipping process}$$

Proof for A construction

$$A(p) = \text{avg \# bits pulled out per flip, when bias is } p \text{ asymptotically in seq length}$$
$$= \frac{2pq}{2} + \frac{p^2 + q^2}{2} A\left(\frac{p^2}{p^2 + q^2}\right) + \frac{1}{2} A(p^2 + q^2)$$

$\nwarrow$  one char for every 2 in original

can show  $A(p) = H(p)$   $\nwarrow$  avg # of bits when got a flip from HH or TT

thus  $A(p)$  pulls out as many bits as  $H(p)$