

Degree distributions in preferential attachment  
random graphs and connections to urns, walks and trees

Part III: Urns, walks and trees

Adrian Röllin, National University of Singapore

(joint with E. Peköz and N. Ross)

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There once was a coupling from France

That was used to hold up some pants,

But the coupling probability is low

And there's lots of room to grow,

So it's best to keep a wide stance.

(E. Pekoż)

There once was a coupling from France

Whose bounds were so tight theorems danced,

With errors so small,

You'll publish it all,

And never again not get grants.

(L. Goldstein)

There once was a coupling from France

That wanted to help us enhance

Our grasp of an urn,

And resolve our concern

That all's just a mere game of chance.

(A. R.)

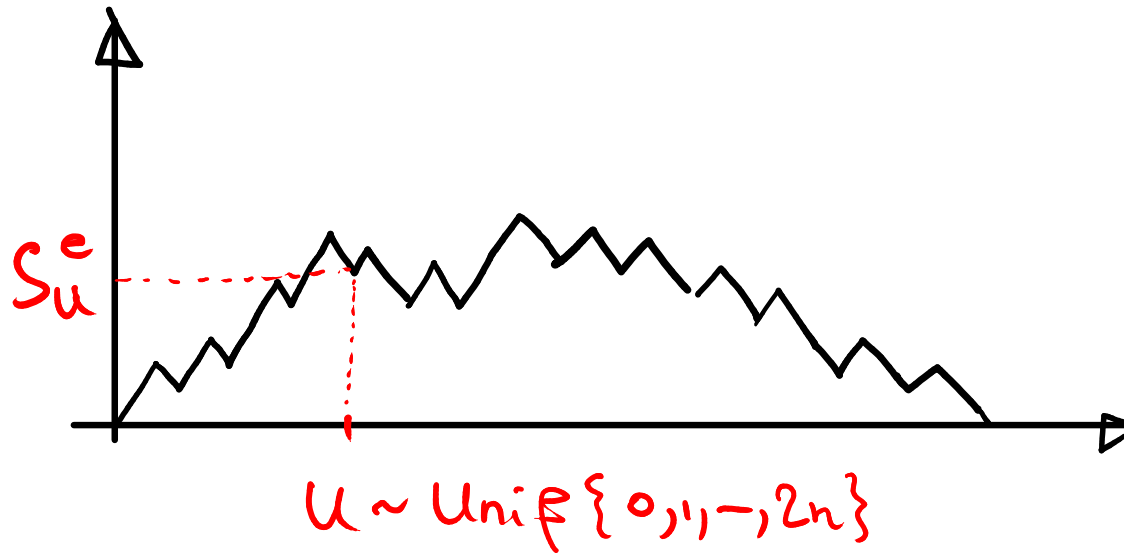
Couplings instead of

Characteristic functions?

It's called Stein's method.

(N. Ross)

# Motivation Simple random walk excursion



$$\frac{S_u^e}{n^{1/2}} \rightarrow \chi_2$$

(Rayleigh)

Proof Donsker's Theorem

and  $B_u^e \sim \chi_2$   $\square$

# Generalized Gamma distribution GG(k,r)

- Density  $r \cdot x^{k-1} e^{-x^r} / \Gamma(k/r)$   $k, r, x > 0$
  - If  $Z \sim GG(k,r)$  then  $\mathbb{E}Z^r = \frac{k}{r} \rightarrow$  scaling
  - Special cases (up to scaling)
    - half normal:  $GG(1,2)$
    - Rayleigh:  $GG(2,2)$
    - Weibull (k):  $GG(k,k)$
    - $\chi_k$ :  $GG(k,2)$
    - $\chi_k^2$ :  $GG(k/2,1)$
- 
- $GG(k,r) \stackrel{\infty}{=} \left( \text{Gamma}\left(\frac{k}{r}\right) \right)^{1/r}$

# Polya urn with immigration

$P_n^l(i, j)$

- start with  $i$  black balls and  $j$  white balls

classic Polya urn

- draw a ball, replace it and add another ball of same colour

immigration

- after every  $l$ -th draw, add a black ball

- $P_n^l(i, j)$  is the no. of white balls!

Thm

If  $W_n \sim P_n^l(1, j)$ ,  $\mu_n^{l+1} = \frac{l+1}{j} E W_n^{l+1}$ , then

$$\sup_{x \geq 0} |\mathbb{P}[W_n / \mu_n \leq x] - \mathbb{P}[z \leq x]| \leq \frac{C}{n^{l/l+1}},$$

where  $z \sim GG(j, l+1)$

• Our interest now :  $P_{n-k}^1(0, 2k-1)$

• Note :  $P_{n-k}^1(0, 2k-1) = P_{n-k-1}^1(1, 2k)$

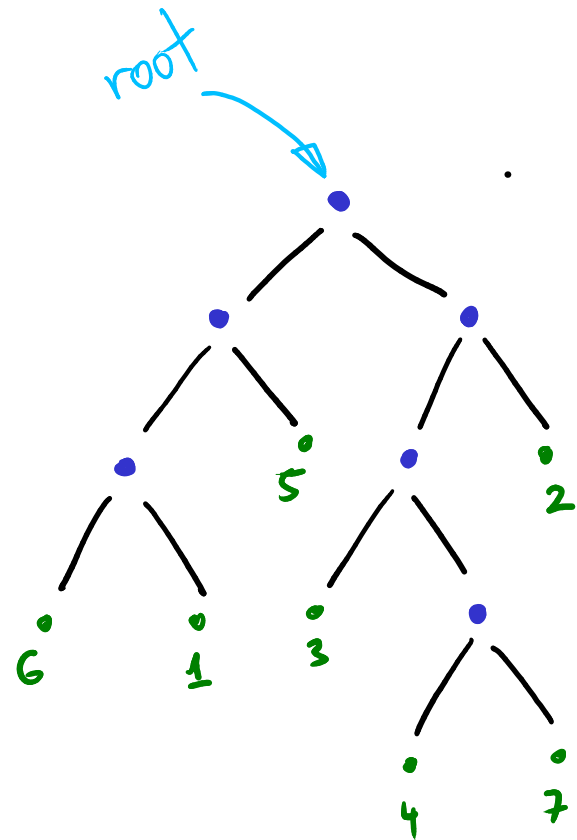
• limits are

$$GG(2k, 2) = X_k$$

•  $l = 1$  : general Polya urn  $\begin{matrix} & b & w \\ b & [2 & 0] \\ w & [1 & 1] \end{matrix}$



# Rooted, decorated, (full) binary plane trees



$n = 7$  leaves  
 $n - 1 = 6$  internal nodes

There are  $n! C_{n-1}$  such trees

$$C_n = \frac{1}{n+1} \binom{2n}{n} \text{ "Catalan numbers"}$$

# Rény's algorithm (1985)

A way to choose uniformly at random among such trees with  $n$  leafs:  $T_n^b$

- To obtain an undecorated tree, just remove the labels.

- Pick leaf at random in the undecorated tree  
 $\Leftrightarrow$  pick leaf 1.

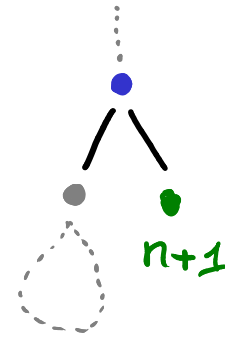
Algorithm :

$$T_n^b \rightarrow T_{n+1}^b$$

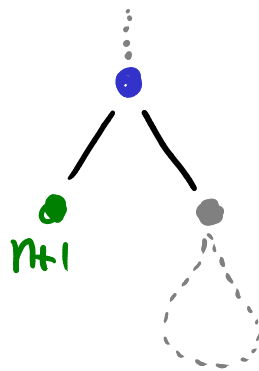
(1) Pick node at random



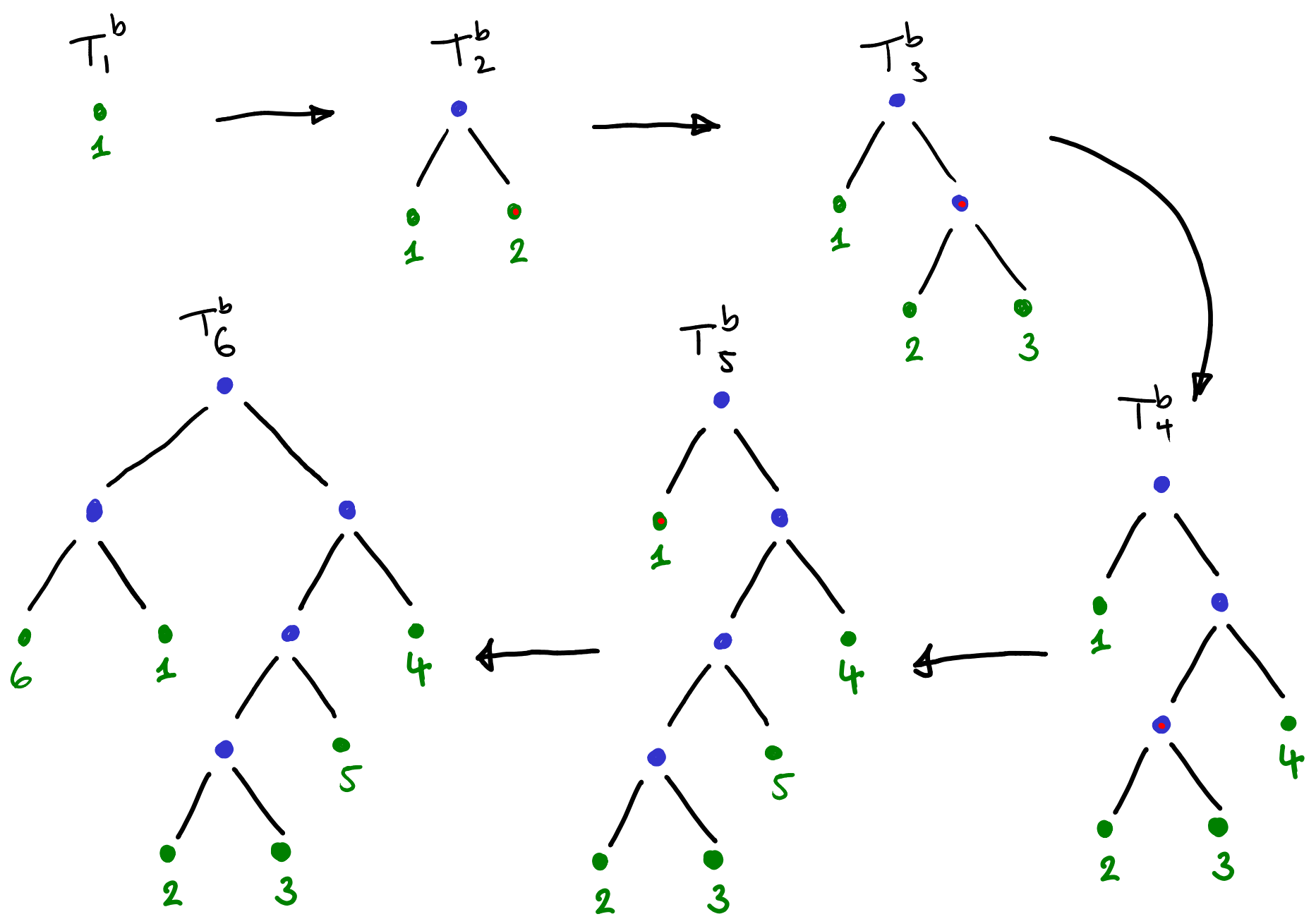
(2) Insert a "cherry" like this



or like this



(probability  $\frac{1}{2}$  each choice)



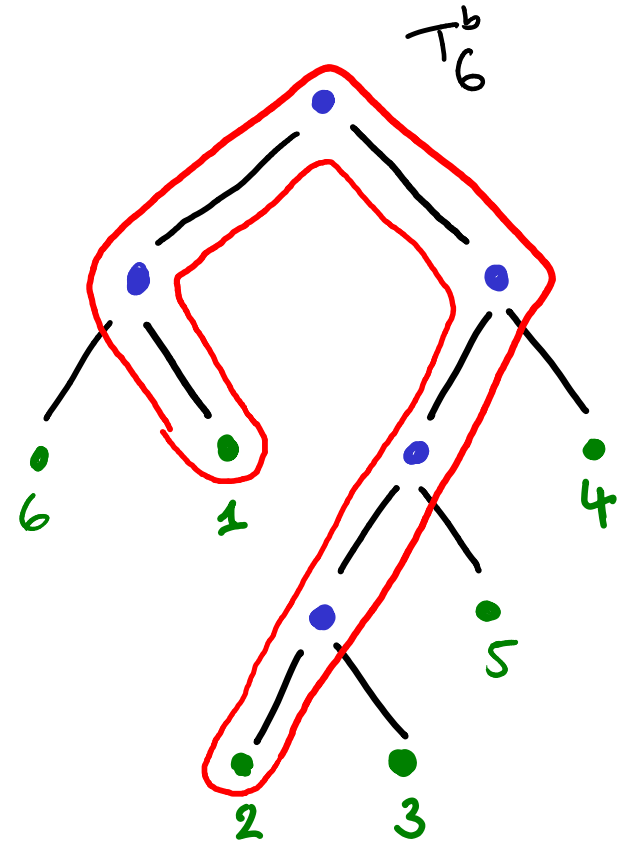
- The resulting tree is chosen uniformly because

- every tree can be obtained in exactly one way,
- choices are made with equal probabilities,
- the number of choices at stage  $n$  is  $(2n-1) \times 2$ .

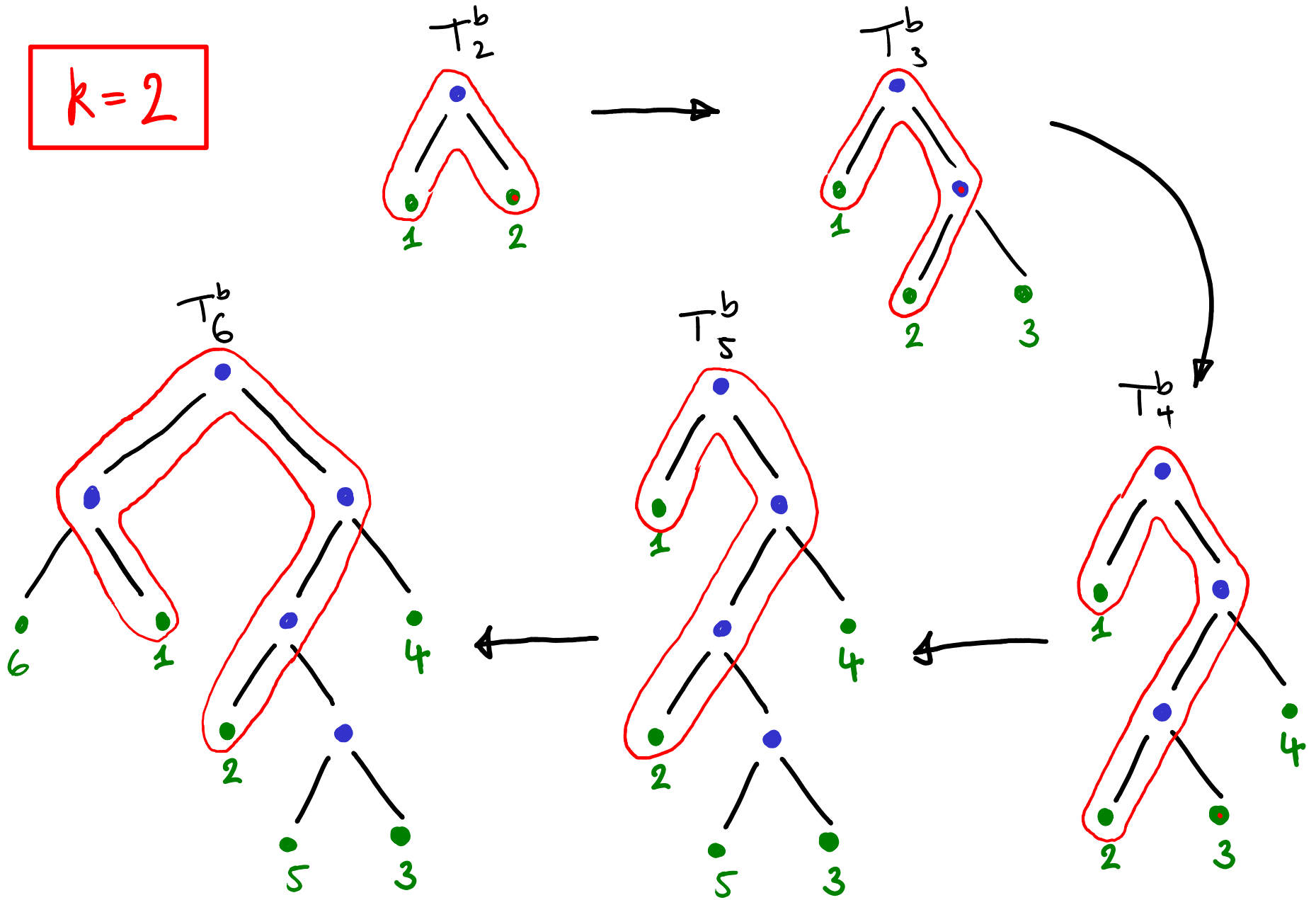
# Spanning subtree

- Pick  $k$  distinct leafs (nodes) at random

- Considers the # of nodes in the subtree spanned by the  $k$  leafs (nodes) and the root



$k=2$



$$\Rightarrow k\text{-leaf-span}(T_n^b) \sim \mathcal{P}_{n-k}^1(0, 2k-1)$$

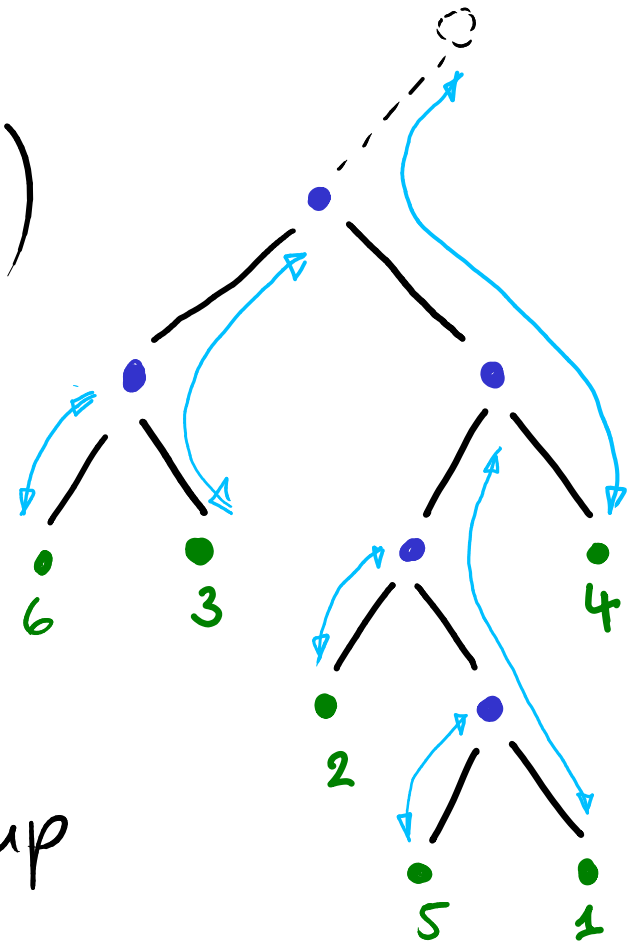
$$\Rightarrow \frac{k\text{-span}(T_n^b)}{\mu_n} \rightarrow \chi_k \quad (\text{rate } \frac{1}{n^{1/2}})$$

- Whenever something is "close" to  $k$ -leaf-span of  $T_n^b$ , we can hope for similar rates.



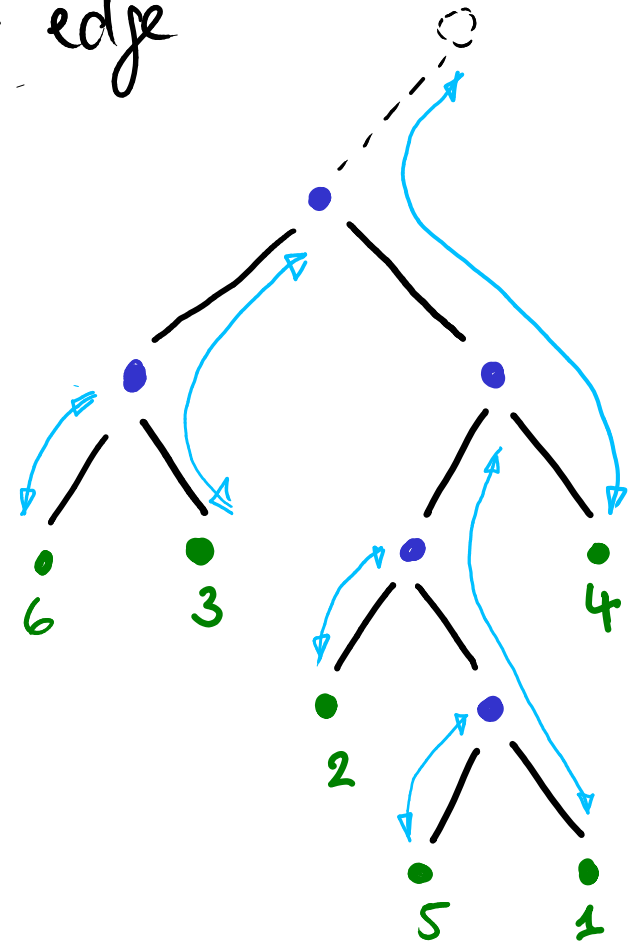
# Spanning subtree of 1 node in $T_n^b$

- We can pair up internal nodes and leaves (if we "plant" the tree)
- Each leaf is paired with the parental node of the first "right turn" on the way up to the root.



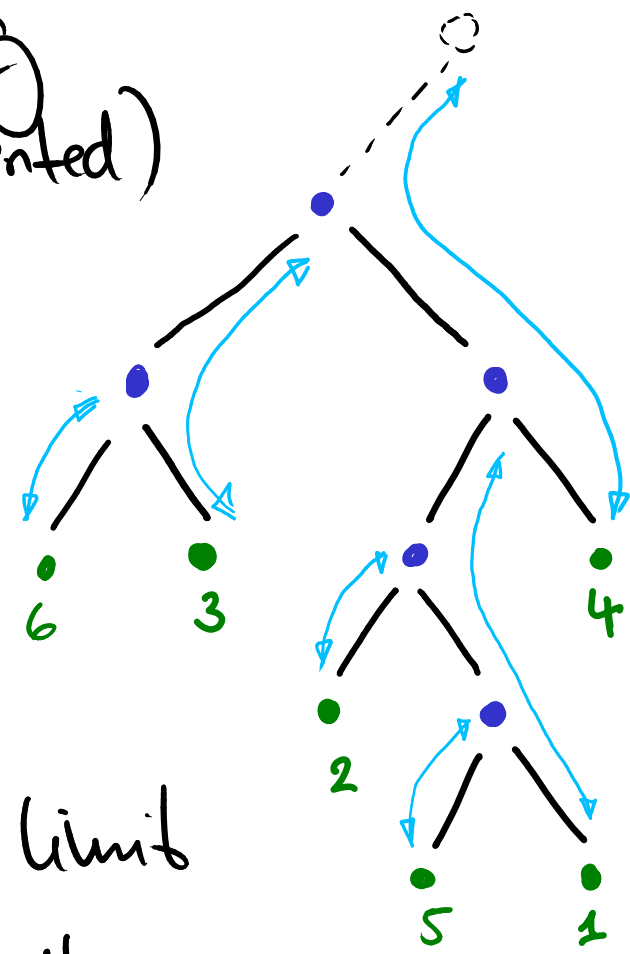
- Each edge in the way up to the root is a left/right edge with prob  $\frac{1}{2}$ .

- The directions of the edges along the path are independent



- $N_{n-1} \sim \mathcal{P}_{n-1}^1(0, 1)$ ,  $Y \sim \text{Ge}(\frac{1}{2})$  (started in 0)
- No. of vertices in 1-spanning subtree of random node (planted)

$$X_n = (N_{n-1} - Y) \vee 0$$



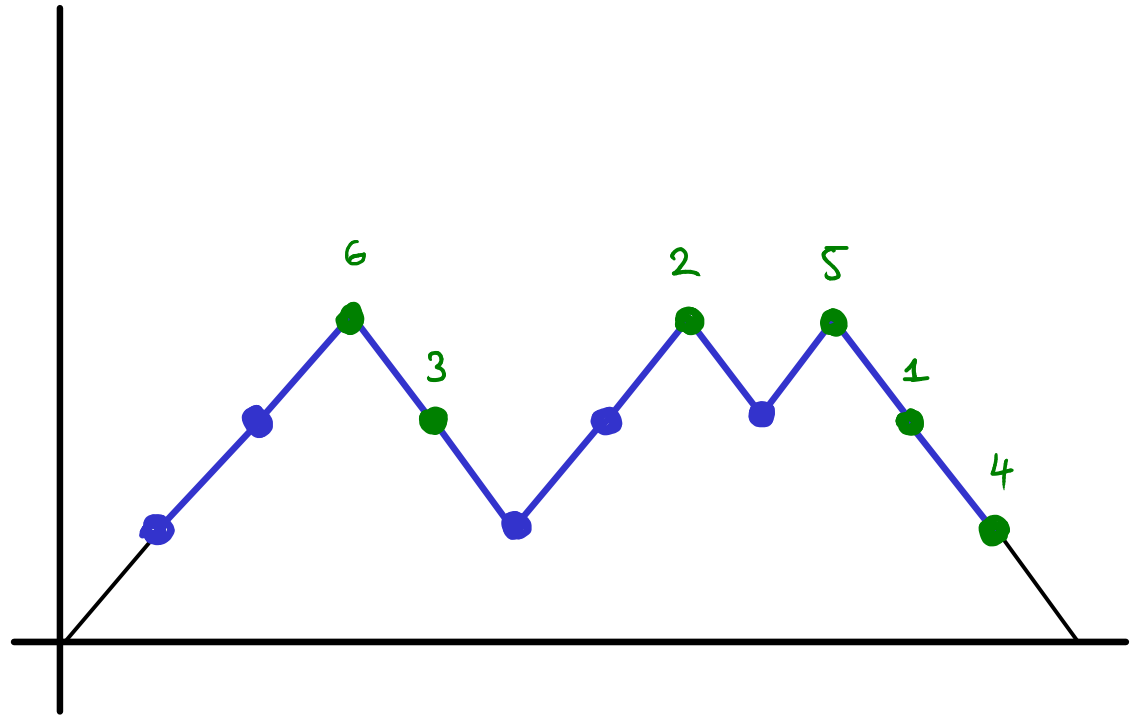
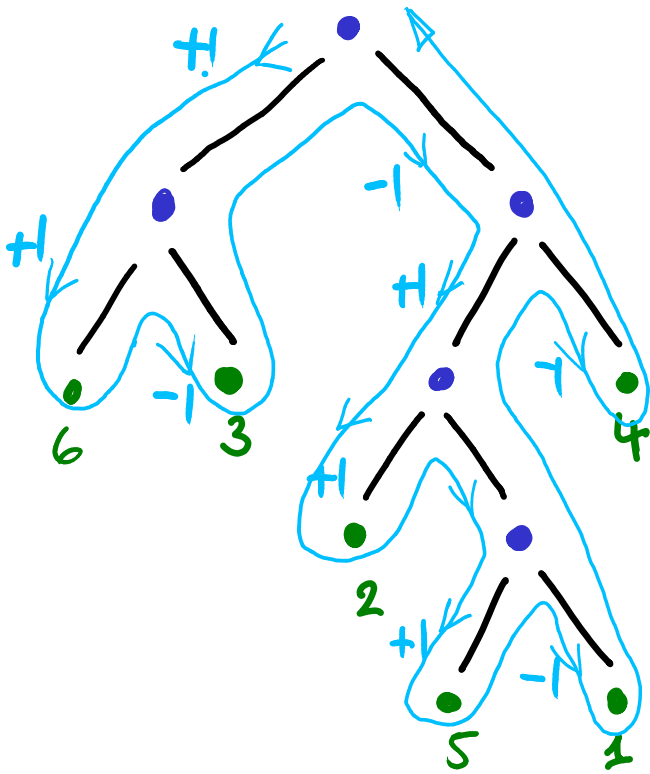
- Unplanted:  $\mathcal{L}(X_n | X_n > 0)$

$\Rightarrow$  rates of convergence to  $X_1$  limit

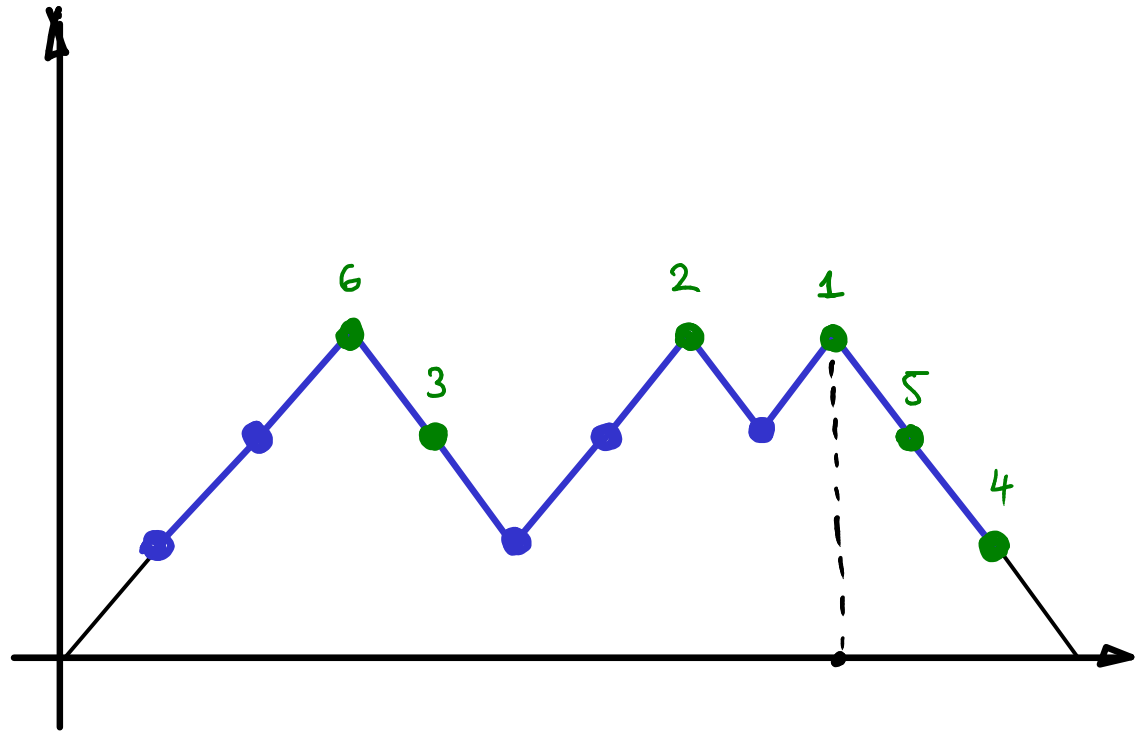
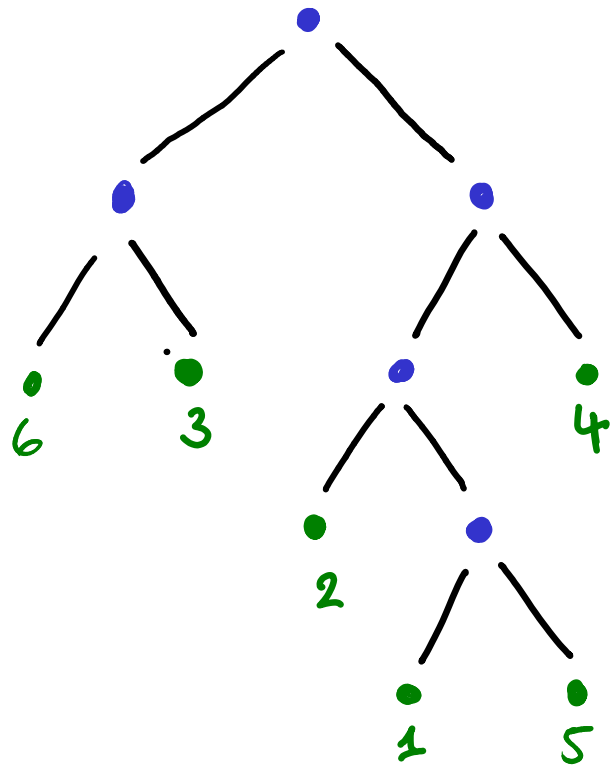
- We can handle plane tree as well.

# Simple random walk excursion

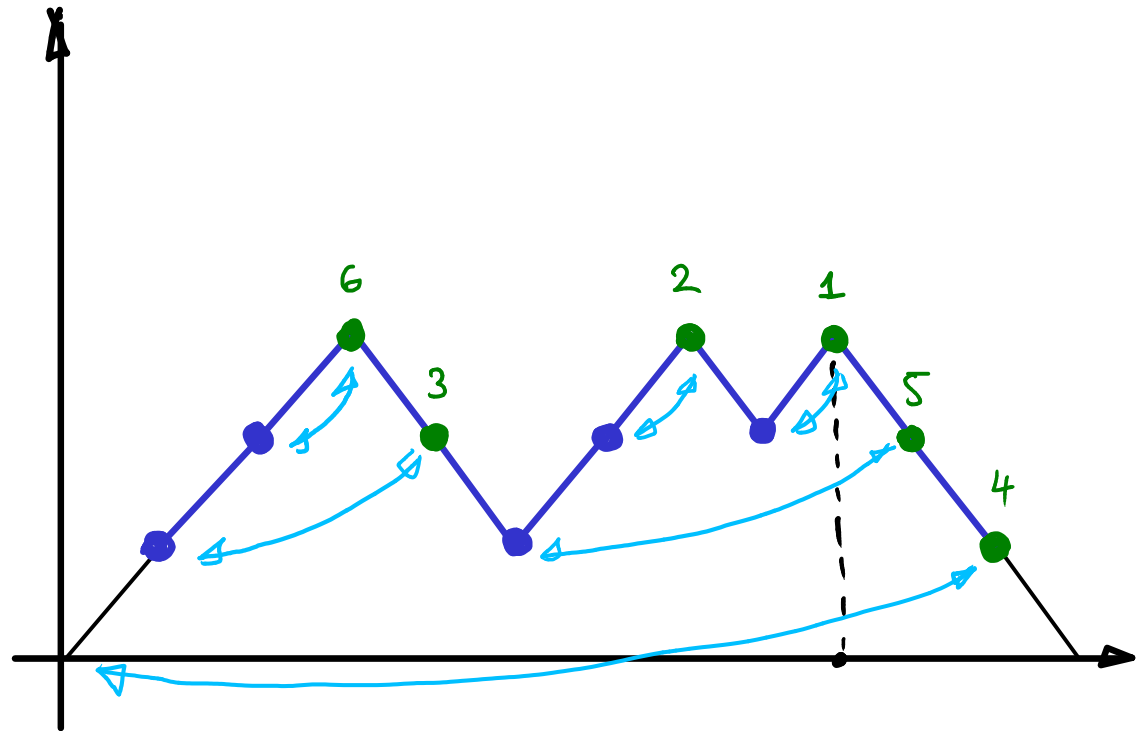
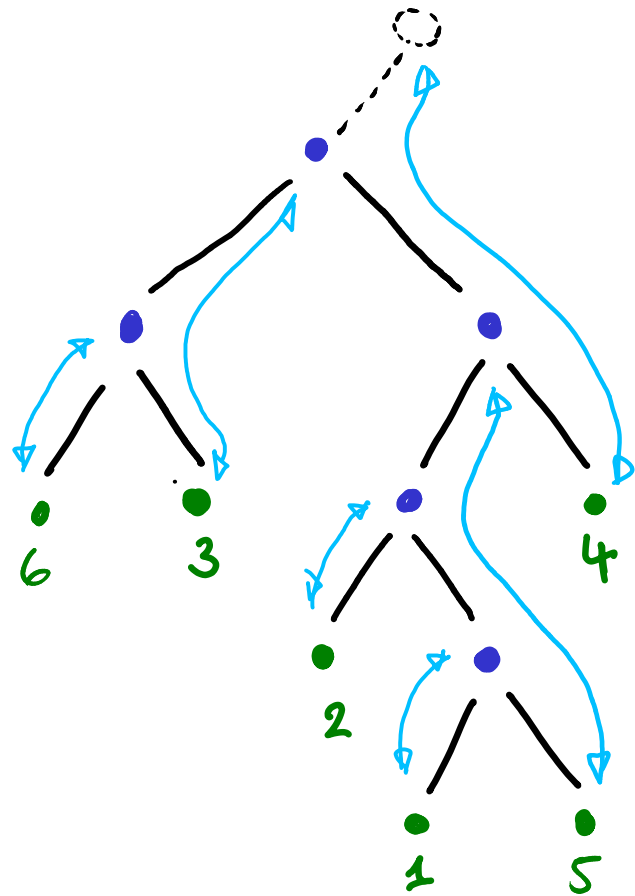
- Use bijection between binary tree and excursion



# Height at random time point



• Height of leaf 1  
= 1 + #"+1" edges in 1-spanning subtree



- $N_{n-1} \sim \mathcal{P}_{n-1}^1(0, 1)$ ,  $H_{\text{leaf } 1} \sim 1 + \text{Bi}(N_{n-1} - 1, 1/2)$

$$H_{\text{Partner of } 1} \sim \text{Bi}(N_{n-1} - 1, 1/2)$$

$\Rightarrow$  Height at random time from  $\{0, 1, \dots, 2n-1\}$

$$\sim \text{Bi}(N_{n-1}, 1/2)$$

- Can also do bridge, meander,  
time at origin of unconditional r.w.