

- TT2? still not quite finished, updates on Piazza...
  - TT3? Details on Quercus; office hours TBA
  - PS4? Later today...
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So far... examples of runtime analysis have been for algorithms with one input  $n$ .

Worst-case running time

Example:     `def is_pal(s: str) → bool:`  
                  `for i in range(len(s)):`  
                    `if s[i] != s[len(s)-1-i]:`  
                      `return False`  
                  `return True`

Note: runtime depends not only on  $n = \text{len}(s)$ ,  
but also on contents of  $s$  itself

Q: what is "the" runtime as a function of  $n$ ?

A: no single answer...

Definitions & notation: For any algorithm  $A$

- $RT_A(\underline{x})$ : runtime (# steps) of  $A$  on input  $x$

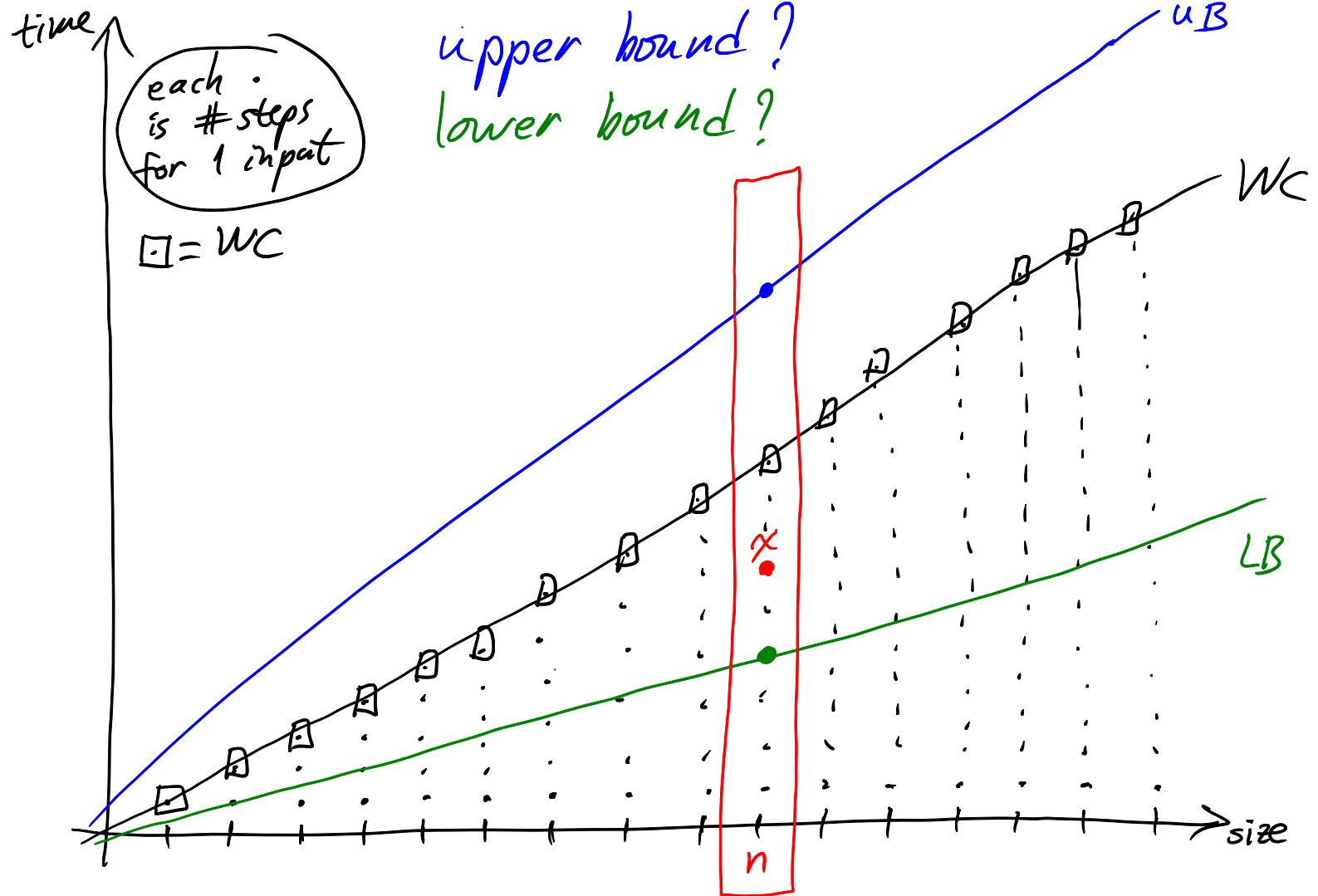
we want function of  $n = \underline{\text{size of } x}$

- $\underline{I_n} = \{x \mid x \text{ is an input of size } n\}$

- worst-case runtime

$$WC_A(n) = \max \{ RT_A(x) \mid x \in I_n \}$$

intuitively: largest runtime of  $A$   
for all inputs of size  $n$



- $g$  is an upper bound on  $WC$  ( $WC(n) \in O(g)$ ):  
 $\exists c, n_0 \in \mathbb{R}^+, \forall n \in \mathbb{N}, n \geq n_0 \Rightarrow \forall x \in \mathcal{I}_n, RT(x) \leq c \cdot g(n)$
- $f$  is a lower bound on  $WC$  ( $WC(n) \in \Omega(f)$ ):  
 $\exists c, n_0 \in \mathbb{R}^+, \forall n \in \mathbb{N}, n \geq n_0 \Rightarrow \exists x \in \mathcal{I}_n, RT(x) \geq c \cdot f(n)$

WARNING: lower bound on worst-case does  
 NOT mean "find an input that takes as little  
 time as possible"

Back to is-pal example...

- Upper bound:  
 WANT: - general argument that applies

to all inputs, for all sizes.

- okay to overestimate
- Let  $n \in \mathbb{N}$ ,  $s$  be any string of length  $n$
- loop performs at most  $n$  iterations
- each iteration takes time at most 1
- total is  $\leq n \Rightarrow \underline{O(n)}$

### Lower bound

- Let  $n \in \mathbb{N}$ .

- Let  $s = \underbrace{"aa \dots a"}_{n \text{ times}}$

input family

not the only choice!

concrete input for each  $n$

- condition of if-statement is never true  
for input  $s$  — loop executes all  $n$  iterations
- runtime  $\geq n \Rightarrow \underline{\Omega(n)}$

Conclusion :  $WC_{is\_pal}(n) \in \Theta(n)$