

CS4311
Design and Analysis of
Algorithms

Tutorial: Randomized Selection

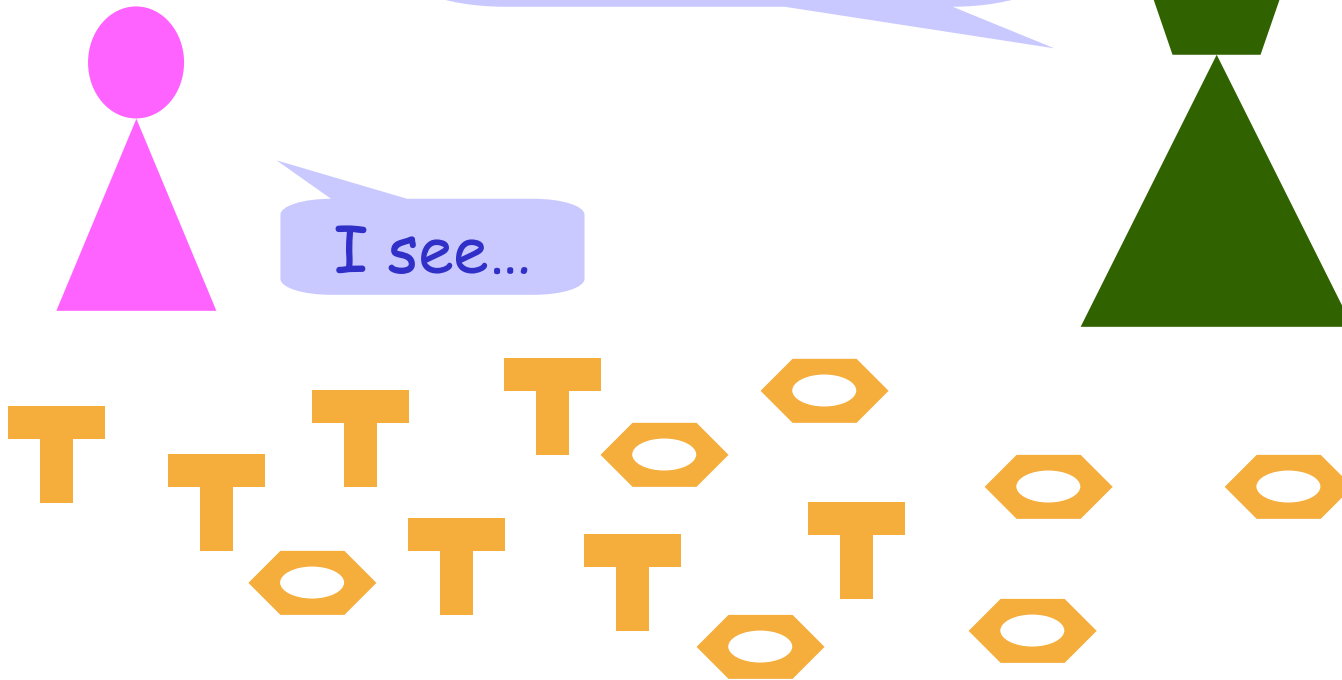
About this tutorial

- Cinderella's New Problem
- Randomized Selection
 - Modification of Quicksort
 - *Average-Case*

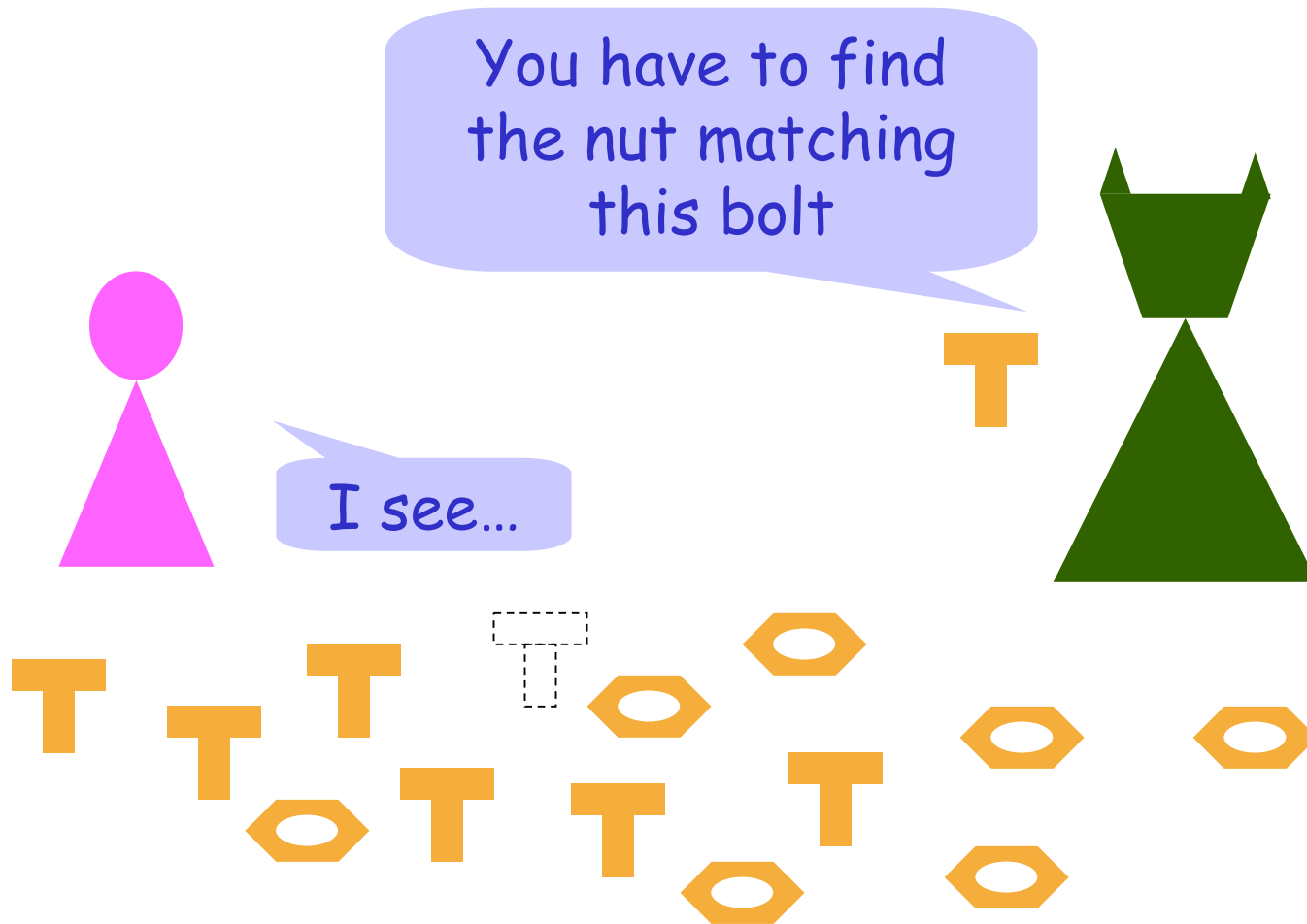
Cinderella's Problem

You have to find
the largest bolt
and the largest nut

I see...

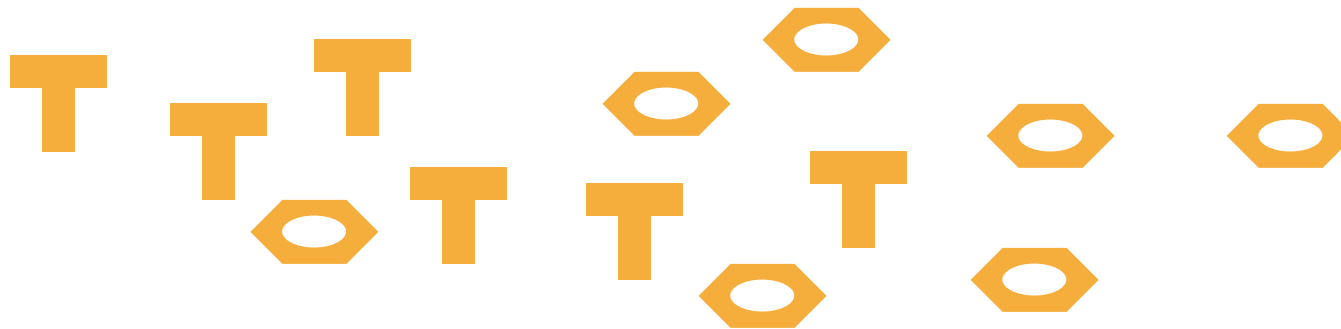
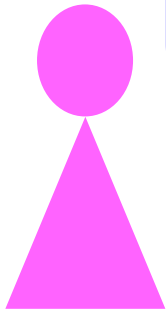
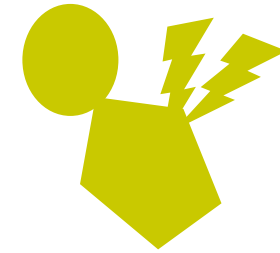


Cinderella's New Problem

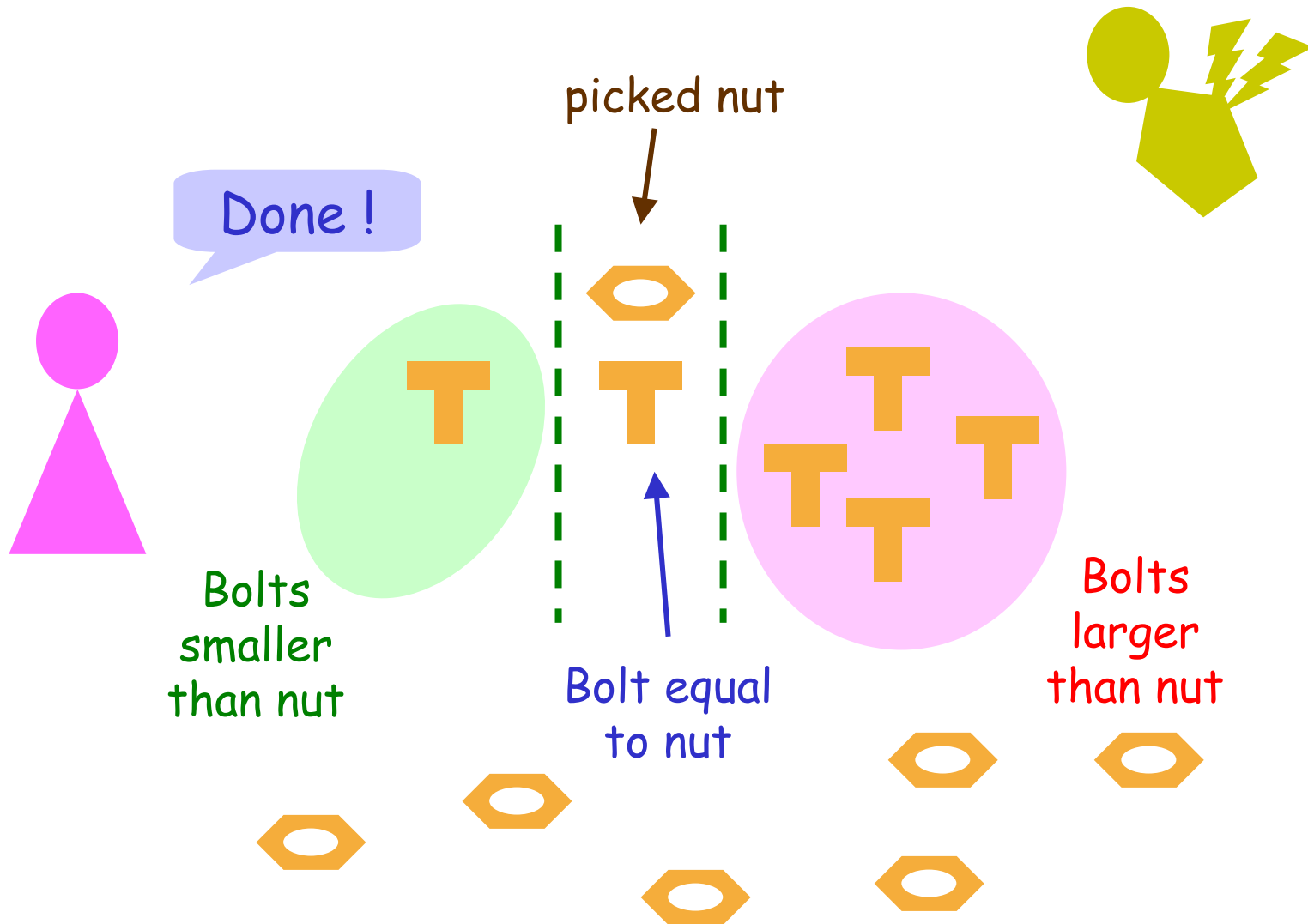


Fairy Godmother's Proposal

1. Pick one of the nut
2. Compare this nut with all other bolts → Find those which are larger, and find those which are smaller

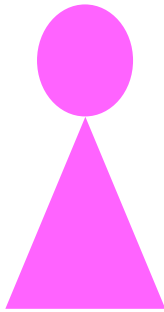
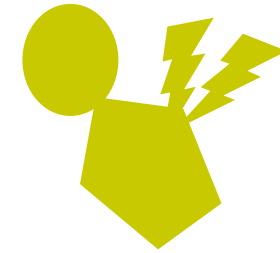


Fairy Godmother's Proposal



Fairy Godmother's Proposal

3. Pick the bolt that is equal to the selected nut
4. Compare this bolt with all other nuts → Find those which are larger, and find those which are smaller



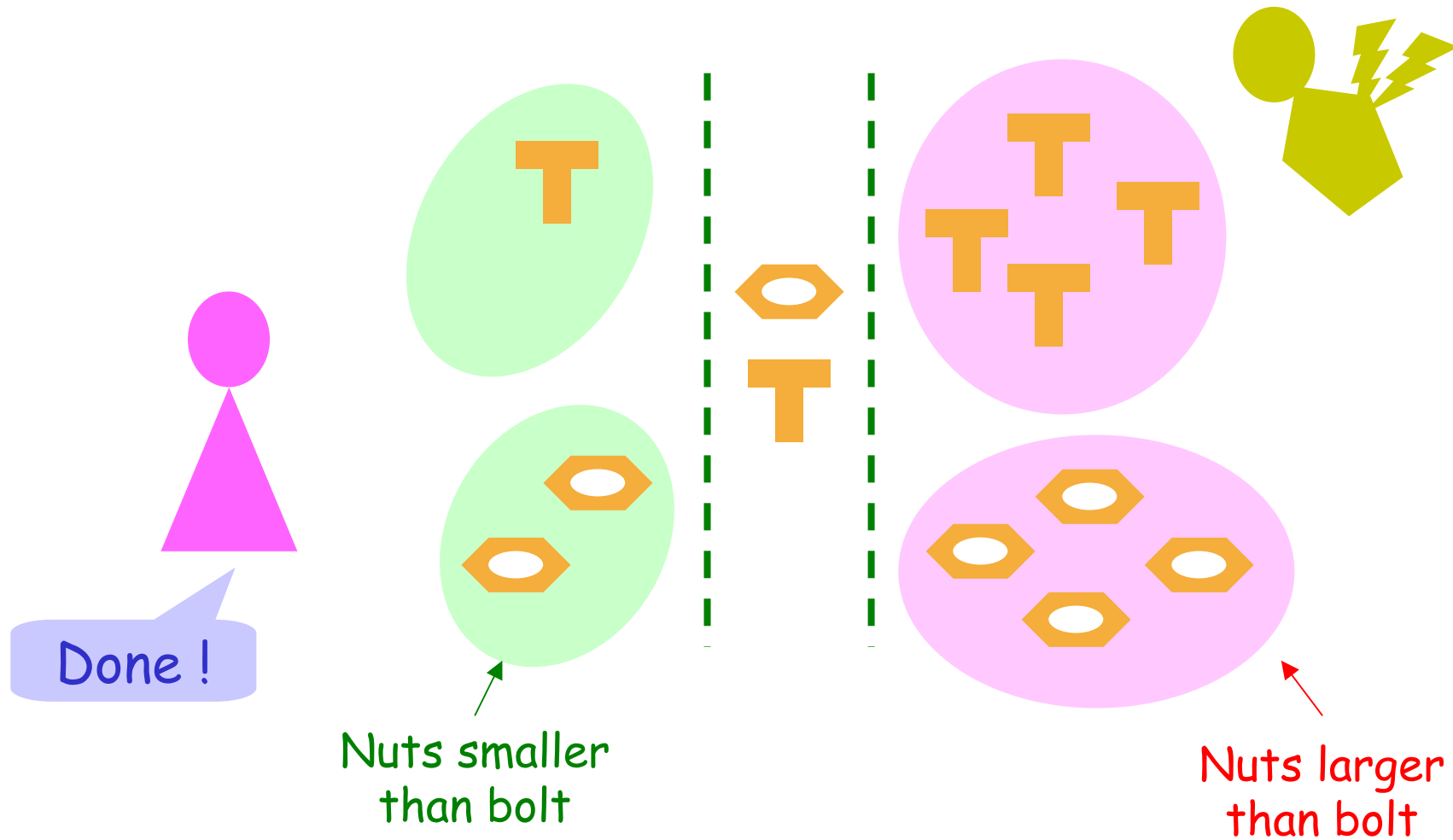
Bolts
smaller
than nut

Bolt equal
to nut

Bolts
larger
than nut



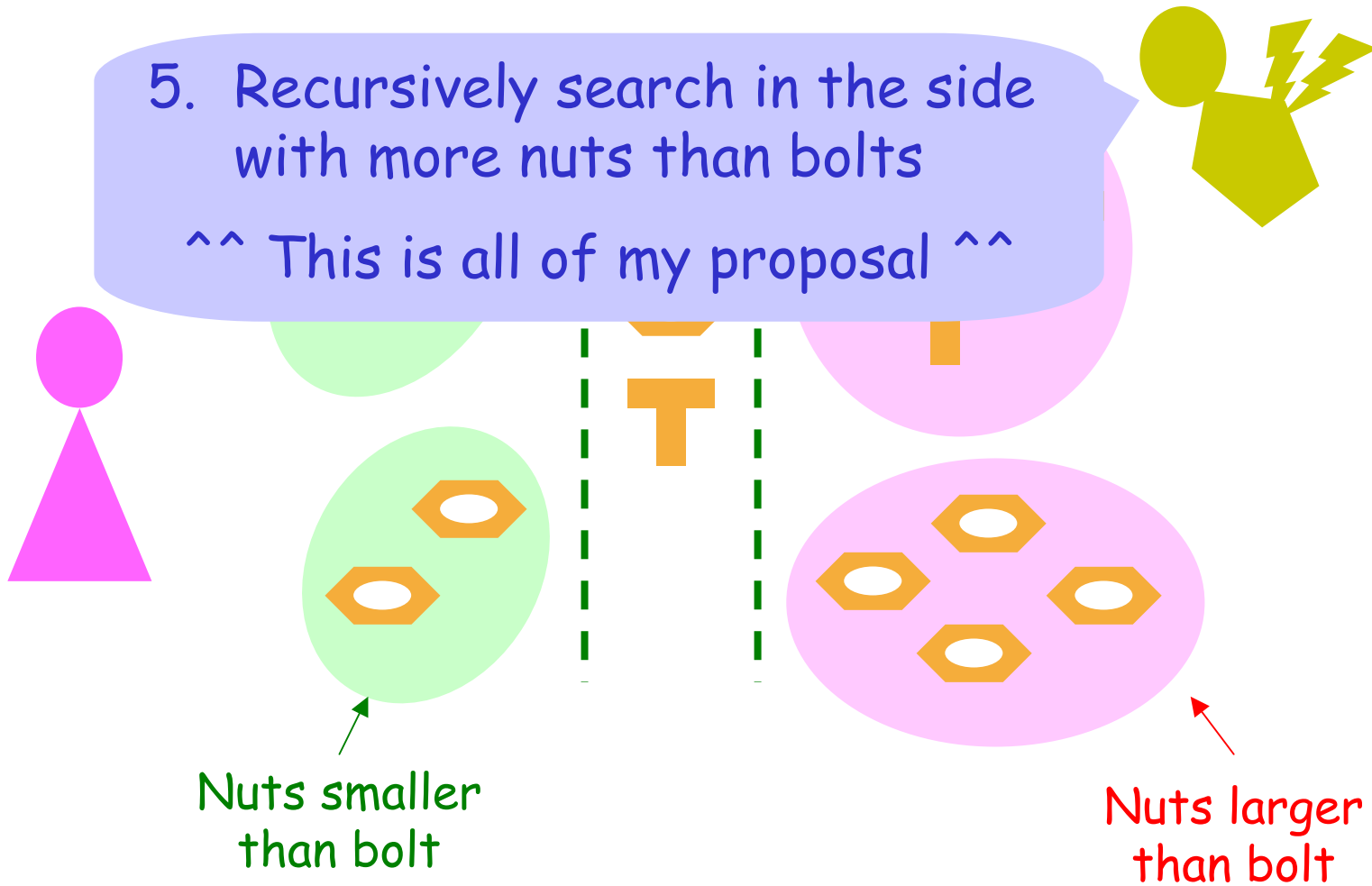
Fairy Godmother's Proposal



Fairy Godmother's Proposal

5. Recursively search in the side with more nuts than bolts

^^ This is all of my proposal ^^



Fairy Godmother's Proposal

- Can you see why Fairy Godmother's proposal is a correct algorithm?
- What is the **running time** ?
 - Worst-case: $\Theta(n^2)$ comparisons
 - **No better than the brute force approach !!**
- Though worst-case runs badly, the average case is good: $\Theta(n)$ comparisons

Review: Quicksort

The Quicksort algorithm works as follows:

```
Quicksort(A,p,r)  /* to sort array A[p..r] */  
  1. if ( p ≥ r ) return;  
  2. q = Partition(A,p,r);  
  3. Quicksort(A, p, p+q-1);  
  4. Quicksort(A, p+q+1, r);
```

To sort $A[1..n]$, we just call $\text{Quicksort}(A,1,n)$

Our Algorithm

The previous algorithm works as follows:

```
/* Search in array A[p..r], knowing that the  
   desired value is inside A[p..r]      */
```

```
Search(A,p,r)
```

1. if ($p \geq r$) return;
2. $q = \text{Partition}(A,p,r)$;
3. If target is in $A[p..p+q-1]$
 Search(A, p, p+q-1);
4. Else Search(A, p+q+1, r);

Average Running Time

- The previous algorithm is called a **selection** algorithm, which allows us to find out the **k**th smallest item, for any **k**
- What is the **average** running time ?

Let $T(n)$ denote average running time on input of size **n**

We shall show that $T(n) = O(n)$

Average Running Time

Inductive Case (assume n is even):

$$T(n) \leq \sum_q (1/n) \max(T(q), T(n-q-1)) + \Theta(n)$$

$$\leq (2/n) \sum_{q=1 \text{ to } n/2} T(n-q-1) + \Theta(n)$$

$$\leq (2/n) c(3n/2-1)(n/2)/2 + \Theta(n)$$

$$= (3/4)cn + \Theta(n)$$

$$\leq cn \quad \text{when } c \text{ is large enough}$$

For odd n , we get $T(n) \leq (3/4)cn + (1/2)c + \Theta(n)$

Average Running Time

Conclusion: $T(n) = O(n)$

- In fact, there is another proof which uses a similar technique as we use in Quicksort

Average Running Time

Let X = # comparisons in all Partition

Then, we have:

$$\text{Running time} = O(n + X) \rightarrow \text{varies on input}$$

Finding average of X (i.e. #comparisons)
gives average running time

Average # of Comparisons

Recall the notation:

- Let a_1, a_2, \dots, a_n denote the set of n numbers initially placed in the array
- Further, assume $a_1 < a_2 < \dots < a_n$
- Let $X_{ij} = \#$ comparisons between a_i and a_j in all Partition calls

Average # of Comparisons

Then, $X = \#$ comparisons in all Partition calls
$$= X_{12} + X_{13} + \dots + X_{n-1,n}$$

→ Average # comparisons :

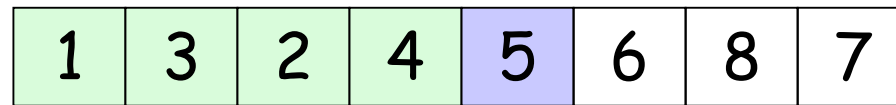
$$\begin{aligned} E[X] &= E[X_{12} + X_{13} + \dots + X_{n-1,n}] \\ &= E[X_{12}] + E[X_{13}] + \dots + E[X_{n-1,n}] \end{aligned}$$

Later, we shall group $E[X_{ij}]$ terms properly,
so that we can easily show $E[X] = O(n)$

Comparison between a_i and a_j

Question: # times a_i be compared with a_j ?

Answer: At most once, which happens only if a_i or a_j are chosen as pivot



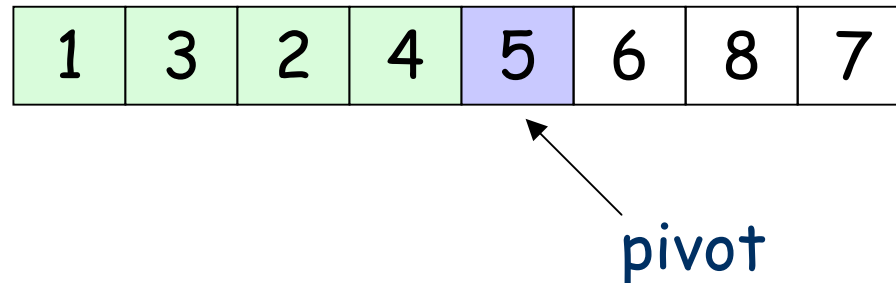
pivot

After that, the pivot is fixed and is never compared with the others

Comparison between a_i and a_j

Question: Will a_i always be compared with a_j ?

Answer: No. E.g., 4 and 6 are not compared



- In addition, if target is the 6th smallest item, then 2 and 4 are also not compared
- When will a comparison occur?