

Binary Search

Not your parents' binary search

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CS 104C

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- ▶ **Python:** `bisect.bisect_left(arr, value)`

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 - ▶ If we have a window of size m with $\leq k$ 1s, then we can easily find a window of size $m-1$ with $\leq k$ 1s — just shrink that same window
 - ▶ If every window of size m has $> k$ 1s, then every window of size $m+1$ will have $> k$ 1s

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Sliding Window Technique

- ▶ **Problem:** Given a boolean array A (with length $1 \leq n \leq 10^6$), what is the largest subarray of 0s you can find if you are allowed to change at most $0 \leq k \leq n$ values in the array?

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- ▶ Say we want to know if it's possible for a fixed size $m \leq n$.
- ▶ Find the sum of the first m elements.
- ▶ “slide” the window by adding the next element and subtracting the first element.

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i	0	1	\dots	$j-1$	j	$j+1$	\dots	$n-2$	$n-1$
$p(i)$	T	T	\dots	T	T	F	\dots	F	F

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- ▶ the first binary search that works correctly for all values of n did not appear until 1962.”
- ▶ A bug was discovered in Java’s binary search as recently as 2006!

Bug free binary search

- ▶ **Function:** `BinarySearch(p , max_input)`
 - ▶ $lo = 0$
 - ▶ $hi = max_input$
 - ▶ `assert $p(lo) == T$`
 - ▶ `assert $p(hi) == F$`
 - ▶ `while $lo + 1 < hi$`
 - ▶ $mid = \lfloor \frac{lo+hi}{2} \rfloor$
 - ▶ `if $p(mid) == T$, then $lo = mid$`
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- ▶ What can you guarantee about lo and hi throughout the program?
- ▶ What is special about lo and hi at the end of the while loop?

Finding high

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- ▶ How can we find that *hi*?

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- ▶ Start with $lo = 0$, $hi = 1$,
- ▶ Keep doubling hi until $p(lo) \neq p(hi)$.

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- ▶ This includes the real numbers!

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- ▶ **Question:** Can we binary search on x (the answer)?
 - ▶ How many iterations of binary search do we need?
 - ▶ The online judge will tell us, but usually 200 or so is overkill for double-precision floats