**Time Complexity**

|  |  |  |
| --- | --- | --- |
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|  |  |  |

(a):

(b):

(c):

(d):

(e):

**Fibonacci 1**

Prove: .

By trial and error: It appears that for all

To prove: For all positive integers

By induction on . Base case:

Step, assume: Indeed, true that for all

To prove:

LHS:

Suffices to prove:

(by dividing the above by )

It is indeed true that

**Multiplication**

Graphical user interface, text, application

Description automatically generated

Suppose instead of both and being n-bit, is n-bit and is m-bit. What is the worst-case time efficiency of ?

Proposed:

Time Efficiency:

So, final answer:

**Fibonacci 2**

Let be the nth Fibonacci number, Prove .

* Somewhere, we have shown:
* But here, seek to show: There exists positive real , for all in
* Natural proof strategy for “there exists” – construction (i.e., propose some concrete , and show that it works)
* Try some small values for , and see what would work
* Appears that works. Adopt it and check if proof goes through. Now, proof by induction with
* Base case,
* Step: Seek to show given that for all
* by induction assumption

**Fibonacci 3**

Let be the nth Fibonacci number, Prove .

* Recall from logic: not (there exists an egg-laying mammal) for all mammals , is not egg-laying
* Here, : There exists positive real , for all natural ,
* So here, need to prove: Given any positive real , it is true that there exists such that
* By contradiction: Suppose that there exists positive real , such that, for all natural ,
* Then:
* This is true only if is “large” compared to
* What is large? We need
* Try :
* Try :
* Try :
* Try :
* Try :
* Try :
* Prove by induction: for all natural
* Base case : See above
* Step:
* So far: We have shown that indeed, for ,

**Selection Sort**

What is a meaningful characterization of the time efficiency of ?

* Suppose we invoke . In . Suppose now, min is at index in . This index of a min in is at index
* Suppose on input: . Then A evolves in as follows:
* For time efficiency: Need to make meaningful assumption(s)
* Customary Assumptions: (1) is unbounded, (ii) each is bounded
* What should we count? Suppose we all agree that counting # swaps is a meaningful measure for time efficiency
* Then:
* Now, let’s say we want to get a bit more fine-grained. Incorporate (worst case) time for each swap # swaps
* So now, time efficiency:

**Modular Simplification**

1. Is ?

So:

So:

Now:

So:

So:

1. Is divisible by ?

Trick: Keep exponentiating until numbers start to repeat.

Suppose we repeatedly exponentiate :

So: . And . So

Now check whether is divisible by . Indeed:

Repeat with . Repeated exponentiation of :

So:

Now: .

.

1. Is a multiple of ?

is prime. And .

Compare with :

.

Show that if has a multiplicative inverse modulo , then this inverse is unique (modulo ).

Let’s assume .

Suppose are both multiplicative inverses of . Then:

: Substitution Rule:

Then:

(2): Commutativity

Suppose . Show that is an integer.

So: , which is divisible by .

We say that is a square root of modulo a prime if . Show that if and has a square root modulo , then is such a square root.

Let be the square root of . Then: .

Write . Then,

Keep in mind: .

Try plugging in in the last expression:

Is ?

So, we’re asking: Is ?

So at least one of: or must be .

We know: There exists such that .

We seek to prove: . Sufficient condition for that to be true:

is okay, because is invertible modulo

**Proving Recurrence 1**

Suppose . Prove recurrence correctness.

Case Analysis:

1. If , then . So, the recurrence is correct for the case where
2. If : then . So
3. If : then . So now:

**Proving Recurrence 2**

Let be the quotient and remainder of and be the quotient and remainder of . Prove recurrence correctness.

To be absolutely clear, what are the quotient and remainder of ?

We call the quotient, and the remainder if and only if and are non-negative integers that satisfy:

Proof by case analysis:

1. If , then . So, recurrence is correct for this case.
2. If is even and : then . So:

Where we infer the last line from the facts that: equation is of the form from definition for quotient and remainder, , and we are given .

1. If is odd and :
2. is even, : . So:

This is of the form of the definition of quotient and remainder, except that we need to confirm that indeed lies between and . Which it does not necessarily. Actually, we are given that and therefore not between and . Now we observe:

Now only question that remains: is it the case that ?

* Is ? Yes, because
* Is ? Yes, because:

1. odd, :

Now:

* because .
* because:

**Proving Recurrence 3**

Prove that is correct.

Above is recursive version of binary search. Iterative version:

Typically, for iterative algorithms, towards correctness, we articulate a *loop invariant*:

Let and be the values of and respectively on input. Just before we successfully enter an iteration of the loop of Line (1), it is true that:

Going back to the recursive version, what is a correctness property?

Given an array that is sorted, non-decreasing, are each on input, returns:

Proof by case analysis:

Case 1: on input: then condition of Line (1) evaluates to **false**, and we correctly return **false** in Line (6). Then, this is either from Line without making any recursive calls, or as the return value from a recursive call from one of Lines or .

For , we first observe that because the only recursive calls are within the block of Line . So, all that remains to be proven is that indeed: .

We prove that by induction on . Base case: . We claim we return within the first recursive invocation. That is, we claim: and , , and .

easy to prove:

is , because then we would have returned in Line .

To prove : we simply exploit:

So, the algorithm is correct if it returns , and .

For the step, we know that on input . So, we returned in some recursive call. So, all we have to prove to appeal to induction assumption: and .

**Proving Master Theorem**

Give a closed form solution for the following recurrence. Assume: is non-decreasing, .

Proposed approach: Inductive “rewriting” of the function . But first: adopt concrete functions wherever we have , or . In this case: adopt for , and for . Now onto the rewriting:

To figure out the power of in that last term:

Power of is the same as the power of inside the . In other words, we’re asking: what is the power of , i.e., for which ? Answer: .

Our next step: Simplify/figure out:

Suppose:

Now subtract one from the other:

When , how do we figure out what is? Answer: then, is:

So, going back to our :

And:

When is ? Answer: .

So, going back to our : first, the case that .

But even before that: rewrite . Because:

So, when . So, in this case:

Onto the other two cases: .

Before we continue: a closer look at :

So: when

So, going back to :

So, if :

And if :

**Proving Greediness**

A picture containing diagram

Description automatically generated

Candidate greedy choice: request with earliest finish time.

Proof strategy: “cut and paste.”

For this problem, we prove two claims in order:

Claim 1: *Suppose for some input of requests, is an optimal (maximum-sized) set of requests which are pairwise conflict-free ordered in increasing finish time. Suppose our greedy algorithm outputs , ordered in increasing finish time. Then, it is true that: for every* .

*Proof.* Note: it must be the case that . And therefore, , i.e., greedy is optimal.

Proof by induction on . Base case: . In our greedy algorithm, we first pick exactly a meeting that finishes earliest amongst all requests. Therefore, immaterial of what is, .

Induction assumption: for , it is true that .

Step: to prove that . We observe:

* – because the set is conflict-free requests, ordered in increasing finish, and therefore, start times.
* – induction assumption.
* Therefore, . Therefore – because after we greedily choose and eliminate all requests that are in conflict, still remains. And our greedy choice is exactly to pick a request that remains that finishes earliest, and we happened to pick .

Claim 2: *Given sets as in Claim 1, cannot exist in* .

*Proof.* By Claim 1, . And because the set is all conflict-free, . Therefore, . So, not in conflict with , and so was available to be chosen after was chosen and all conflicts were eliminated.

Contradiction to the assumption that greedy algorithm terminates only when no more requests available to choose from.

**Graph Algorithm 1**

Graphical user interface, text

Description automatically generated

Time efficiency of

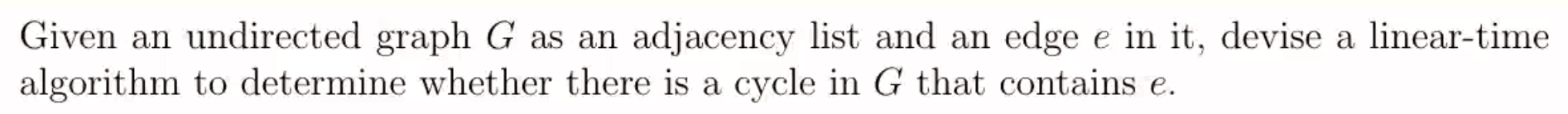
Perhaps a better (more efficiency) approach:

* Visit each vertex as though it is someone’s neighbor.
* Measure its degree.
* Walk its adj list again and inform each neighbor of the degree so they can update their .

Time efficiency:

* We visit each vertex once – Line (4) loop.
* We visit each edge four times – Line (6) and Line (7), we walk each adj list twice.
* So total time: .

**Graph Algorithm 2**



“Go-to” linear time algorithms for graphs: DFS and BFS.

Idea:

* DFS, check if back edge results in DFS tree.
* In fact, edit the explore routine as follows:
  + Keep track of parent in DFS tree.
  + Every time we hit a vertex, check if edge to root of DFS tree, and root is not parent in DFS tree.
  + If yes, immediately output **true**.