Matrix Multiplication

Given two vectors $\vec{a} = [a_1, \ldots, a_k]$ and $\vec{b} = [b_1, \ldots, b_k]$, their *inner product* (or *dot product*) is

$$\vec{a} \cdot \vec{b} = \sum_{i=1}^{k} a_i b_i$$

- $[1, 2, 3] \cdot [-2, 4, 6] = (1 \times -2) + (2 \times 4) + (3 \times 6) = 24.$

We can multiply an $n \times m$ matrix $A = [a_{ij}]$ by an $m \times k$ matrix $B = [b_{ij}]$, to get an $n \times k$ matrix $C = [c_{ij}]$:

- $c_{ij} = \Sigma_{r=1}^{m} a_{ir} b_{rj}$
- this is the inner product of the ith row of A with the jth column of B

- $\begin{bmatrix} 2 & 3 & 1 \\ 5 & 7 & 4 \end{bmatrix} \times \begin{bmatrix} 3 & 7 \\ 4 & 2 \\ -1 & -2 \end{bmatrix} = \begin{bmatrix} 17 & 18 \\ 39 & 41 \end{bmatrix}$

$$\begin{aligned} 17 &= (2 \times 3) + (3 \times 4) + (1 \times -1) \\ &= (2, 3, 1) \cdot (3, 4, -1) \\ 18 &= (2 \times 7) + (3 \times 2) + (1 \times -2) \\ &= (2, 3, 1) \cdot (7, 2, -2) \\ 39 &= (5 \times 3) + (7 \times 4) + (4 \times -1) \\ &= (5, 7, 4) \cdot (3, 4, -1) \\ 41 &= (5 \times 7) + (7 \times 2) + (4 \times -2) \\ &= (5, 7, 4) \cdot (7, 2, -2) \end{aligned}$$

Why is multiplication defined in this strange way?

- Because it's useful!

Suppose

$$\begin{array}{ll} z_1 = 2y_1 + 3y_2 + y_3 & y_1 = 3x_1 + 7x_2 \\ z_2 = 5y_1 + 7y_2 + 4y_3 & y_2 = 4x_1 + 2x_2 \\ & y_3 = -x_1 - 2x_2 \end{array}$$

Thus, $\begin{bmatrix} z_1 \\ z_2 \end{bmatrix} = \begin{bmatrix} 2 & 3 & 1 \\ 5 & 7 & 4 \end{bmatrix} \cdot \begin{bmatrix} y_1 \\ y_2 \\ y_3 \end{bmatrix}$ and $\begin{bmatrix} y_1 \\ y_2 \\ y_3 \end{bmatrix} = \begin{bmatrix} 3 & 7 \\ 4 & 2 \\ -1 & -2 \end{bmatrix} \cdot \begin{bmatrix} x_1 \\ x_2 \end{bmatrix}$.

Suppose we want to express the z's in terms of the x's:

$$\begin{aligned} z_1 &= 2y_1 + 3y_2 + y_3 \\ &= 2(3x_1 + 7x_2) + 3(4x_1 + 2x_2) + (-x_1 - 2x_2) \\ &= (2 \times 3 + 3 \times 4 + (-1))x_1 + (2 \times 7 + 3 \times 2 + (-2))x_2 \\ &= 17x_1 + 18x_2 \end{aligned}$$

Similarly, $z_2 = 39x_1 + 41x_2$.

$$\begin{bmatrix} z_1 \\ z_2 \end{bmatrix} = \begin{bmatrix} 2 & 3 & 1 \\ 5 & 7 & 4 \end{bmatrix} \cdot \begin{bmatrix} 3 & 7 \\ 4 & 2 \\ -1 & -2 \end{bmatrix} \cdot \begin{bmatrix} x_1 \\ x_2 \end{bmatrix}.$$

Algorithms

An *algorithm* is a recipe for solving a problem.

In the book, a particular language is used for describing algorithms.

- You need to learn the language well enough to read the examples
- You need to learn to express your solution to a problem algorithmically and *unambiguously*
- YOU DO NOT NEED TO LEARN IN DETAIL ALL THE IDIOSYNCRACIES OF THE PARTICULAR LANGUAGE USED IN THE BOOK.
  - You will not be tested on it, nor will most of the questions in homework use it
  - I suggest you skim Chapter 1; I won't cover it

Methods of Proof

One way of proving things is by induction.

- That's coming next.

What if you can't use induction?

Typically you're trying to prove a statement like "Given X, prove (or show that) Y". This means you have to prove

$$X \Rightarrow Y$$

In the proof, you're allowed to assume X, and then show that Y is true, using X.

- A special case: if there is no X, you just have to prove Y or $\mathit{true} \Rightarrow Y$.

Alternatively, you can do a *proof by contradiction*: Assume that Y is false, and show that X is false.

- This amounts to proving

$$\neg Y \Rightarrow \neg X$$

Example

Theorem n is odd iff (in and only if) n^2 is odd, for $n \in Z$.

Proof: We have to show

1. n odd $\Rightarrow$ n^2 odd
2. n^2 odd $\Rightarrow$ n odd

For (1), if n is odd, it is of the form $2k + 1$. Hence,

$$n^2 = 4k^2 + 4k + 1 = 2(2k^2 + 2k) + 1$$

Thus, n^2 is odd.

For (2), we proceed by contradiction. Suppose n^2 is odd and n is even. Then $n = 2k$ for some k, and $n^2 = 4k^2$. Thus, n^2 is even. This is a contradiction. Thus, n must be odd.

A Proof By Contradiction

Theorem: $\sqrt{2}$ is irrational.

Proof: By contradiction. Suppose $\sqrt{2}$ is rational. Then $\sqrt{2} = a/b$ for some $a, b \in N^+$. We can assume that a/b is in lowest terms.

- Therefore, a and b can't both be even.

Squaring both sides, we get

$$2 = a^2/b^2$$

Thus, $a^2 = 2b^2$, so a^2 is even. This means that a must be even.

Suppose $a = 2c$. Then $a^2 = 4c^2$.

Thus, $4c^2 = 2b^2$, so $b^2 = 2c^2$. This means that b^2 is even, and hence so is b.

Contradiction!

Thus, $\sqrt{2}$ must be irrational.

Induction

This is perhaps the most important technique we'll learn for proving things.

Idea: To prove that a statement is true for all natural numbers, show that it is true for 1 (*base case* or *basis step*) and show that if it is true for n, it is also true for $n+1$ (*inductive step*).

- The base case does not have to be 1; it could be 0, 2, 3, ...
- If the base case is k, then you are proving the statement for all $n \geq k$.

It is sometimes quite difficult to formulate the statement to prove.

IN THIS COURSE, I WILL BE VERY FUSSY ABOUT THE FORMULATION OF THE STATEMENT TO PROVE. YOU MUST STATE IT VERY CLEARLY. I WILL ALSO BE PICKY ABOUT THE FORM OF THE INDUCTIVE PROOF.

Writing Up a Proof by Induction

1. State the hypothesis very clearly:
   - Let $P(n)$ be the (English) statement . . . [some statement involving n]
2. The basis step
   - $P(k)$ holds because . . . [where k is the base case, usually 0 or 1]
3. Inductive step
   - Assume $P(n)$. We prove $P(n+1)$ holds as follows . . . Thus, $P(n) \Rightarrow P(n+1)$.
4. Conclusion
   - Thus, we have shown by induction that $P(n)$ holds for all $n \geq k$ (where k was what you used for your basis step). [It's not necessary to always write the conclusion explicitly.]

A Simple Example

Theorem: For all positive integers n,

$$\sum_{k=1}^{n} k = \frac{n(n+1)}{2}.$$

Proof: By induction. Let $P(n)$ be the statement

$$\sum_{k=1}^{n} k = \frac{n(n+1)}{2}.$$

Basis: $P(1)$ asserts that $\Sigma_{k=1}^{1} k = \frac{1(1+1)}{2}$. Since the LHS and RHS are both 1, this is true.

Inductive step: Assume $P(n)$. We prove $P(n+1)$. Note that $P(n+1)$ is the statement

$$\sum_{k=1}^{n+1} k = \frac{(n+1)(n+2)}{2}.$$

$$\begin{aligned}
\Sigma_{k=1}^{n+1} k &= \Sigma_{k=1}^{n} k + (n+1) \\
&= \tfrac{n(n+1)}{2} + (n+1)[\text{Induction hypothesis}] \\
&= \tfrac{n(n+1)+2(n+1)}{2} \\
&= \tfrac{(n+1)(n+2)}{2}
\end{aligned}$$

Thus, $P(n)$ implies $P(n+1)$, so the result is true by induction.

Notes:

- You can write $\overset{P(n)}{=}$ instead of writing "Induction hypothesis" at the end of the line, or you can write "$P(n)$" at the end of the line.
  - Whatever you write, make sure it's clear when you're applying the induction hypothesis
- Notice how we rewrite $\Sigma_{k=1}^{n+1} k$ so as to be able to appeal to the induction hypothesis. This is standard operating procedure.

Another example

Theorem: $(1+x)^n \geq 1+nx$ for all nonnegative integers n and all $x \geq -1$. (Take $0^0 = 1$.)

Proof: By induction on n. Let $P(n)$ be the statement $(1+x)^n \geq 1+nx$.

Basis: $P(0)$ says $(1+x)^0 \geq 1$. This is clearly true.

Inductive Step: Assume $P(n)$. We prove $P(n+1)$.

$$\begin{aligned}(1+x)^{n+1} &= (1+x)^n(1+x) \\ &\geq (1+nx)(1+x)[\text{Induction hypothesis}] \\ &= 1+nx+x+nx^2 \\ &= 1+(n+1)x+nx^2 \\ &\geq 1+(n+1)x\end{aligned}$$

- Why does this argument fail if $x < -1$?

Towers of Hanoi

Problem: Move all the rings from pole 1 and pole 2, moving one ring at a time, and never having a larger ring on top of a smaller one.

How do we solve this?

- Think recursively!
- Suppose you could solve it for $n-1$ rings? How could you do it for n?

Solution

- Move top $n-1$ rings from pole 1 to pole 3 (we can do this by assumption)
  - Pretend largest ring isn't there at all
- Move largest ring from pole 1 to pole 2
- Move top $n-1$ rings from pole 3 to pole 2 (we can do this by assumption)
  - Again, pretend largest ring isn't there

This solution translates to a recursive algorithm:

- Suppose robot($r \rightarrow s$) is a command to a robot to move the top ring on pole r to pole s
- Note that if $r, s \in \{1, 2, 3\}$, then $6-r-s$ is the other number in the set

procedure H(n, r, s) [Move n disks from r to s]
  if $n = 1$ **then** robot($r \rightarrow s$)
    else $H(n-1, r, 6-r-s)$
      robot($r \rightarrow s$)
      $H(n-1, 6-r-s, s)$
  endif
  return
endpro

Towers of Hanoi: Analysis

Theorem: It takes $2^n - 1$ moves to perform $H(n, r, s)$, for all positive n, and all $r, s \in \{1, 2, 3\}$.

Proof: Let $P(n)$ be the statement "It takes $2^n - 1$ moves to perform $H(n, r, s)$ and all $r, s \in \{1, 2, 3\}$."

- Note that "for all positive n" is not part of $P(n)$!
- $P(n)$ is a statement about a particular n.
- If it were part of $P(n)$, what would $P(1)$ be?

Basis: $P(1)$ is immediate: robot$(r \to s)$ is the only move in $H(1, r, s)$, and $2^1 - 1 = 1$.

Inductive step: Assume $P(n)$. To perform $H(n+1, r, s)$, we first do $H(n, r, 6 - r - s)$, then robot$(r \to s)$, then $H(n, 6 - r - s, s)$. Altogether, this takes $2^n - 1 + 1 + 2^n - 1 = 2^{n+1} - 1$ steps.

A Matching Lower Bound

Theorem: Any algorithm to move n rings from pole r to pole s requires at least $2^n - 1$ steps.

Proof: By induction, taking the statement of the theorem to be $P(n)$.

Basis: Easy: Clearly it requires (at least) 1 step to move 1 ring from pole r to pole s.

Inductive step: Assume $P(n)$. Suppose you have a sequence of steps to move $n+1$ rings from r to s. There's a first time and a last time you move ring $n+1$:

- Let k be the first time
- Let k' be the last time.
- Possibly $k = k'$ (if you only move ring $n+1$ once)

Suppose at step k, you move ring $n+1$ from pole r to pole s'.

- You can't assume that $s' = s$, although this is optimal.

Key point:

- The top n rings have to be on the third pole, $6-r-s'$
- Otherwise, you couldn't move ring $n+1$ from r to s'.

By $P(n)$, it took at least $2^n - 1$ moves to get the top n rings to pole $6 - r - s'$.

At step k', the last time you moved ring $n+1$, suppose you moved it from pole r' to s (it has to end up at s).

- the other n rings must be on pole $6 - r' - s$.
- By $P(n)$, it takes at least $2^n - 1$ moves to get them to ring s (where they have to end up).

So, altogether, there are at least $2(2^n - 1) + 1 = 2^{n+1} - 1$ moves in your sequence:

- at least $2^n - 1$ moves before step k
- at least $2^n - 1$ moves after step k'
- step k itself.

If course, if $k \neq k'$ (that is, if you move ring $n+1$ more than once) there are even more moves in your sequence.

Strong Induction

Sometimes when you're proving $P(n+1)$, you want to be able to use $P(j)$ for $j \leq n$, not just $P(n)$. You can do this with *strong induction*.

1. Let $P(n)$ be the statement ... [some statement involving n]
2. The basis step
   - $P(k)$ holds because ... [where k is the base case, usually 0 or 1]
3. Inductive step
   - Assume $P(k), \ldots, P(n)$ holds. We show $P(n+1)$ holds as follows ...

Although strong induction looks stronger than induction, it's not. Anything you can do with strong induction, you can also do with regular induction, by appropriately modifying the induction hypothesis.

- If $P(n)$ is the statement you're trying to prove by strong induction, let $P'(n)$ be the statement $P(1), \ldots, P(n)$ hold. Proving $P'(n)$ by regular induction is the same as proving $P(n)$ by strong induction.

An example using strong induction

Theorem: Any item costing $n > 7$ kopecks can be bought using only 3-kopeck and 5-kopeck coins.

Proof: Using strong induction. Let $P(n)$ be the statement that n kopecks can be paid using 3-kopeck and 5-kopeck coins, for $n \geq 8$.

Basis: $P(8)$ is clearly true since $8 = 3 + 5$.

Inductive step: Assume $P(8), \ldots, P(n)$ is true. We want to show $P(n+1)$. If $n+1$ is 9 or 10, then it's easy to see that there's no problem ($P(9)$ is true since $9 = 3 + 3 + 3$, and $P(10)$ is true since $10 = 5 + 5$). Otherwise, note that $(n+1) - 3 = n - 2 \geq 8$. Thus, $P(n-2)$ is true, using the induction hypothesis. This means we can use 3- and 5-kopeck coins to pay for something costing $n-2$ kopecks. One more 3-kopeck coin pays for something costing $n+1$ kopecks.

Bubble Sort

Suppose we wanted to sort n items. Here's one way to do it:

Input n [number of items to be sorted]
$w_1, \ldots, w_n$ [items]

Algorithm BubbleSort
for $i = 1$ to $n - 1$
for $j = 1$ to $n - i$
if $w_j > w_{j+1}$ **then** switch(w_j, w_{j+1}) **endif**
endfor
endfor

Why is this right:

- Intuitively, because largest elements "bubble up" to the top

How many comparisons?

- Best case, worst case, average case all the same:
  - $(n-1) + (n-2) + \cdots + 1 = n(n-1)/2$

Proving Bubble Sort Correct

We want to show that the algorithm is correct by induction. What's the statement of the induction?

Could take $P(n)$ to be the statement: the algorithm works correctly for n inputs.

- That turns out to be a tough induction statement to work with.
- Suppose $P(1)$ is true. How do you prove $P(2)$?

A better choice:

- $P(k)$ is the statement that, if there are n inputs and $k \leq n-1$, then after k iterations of the outer loop, $w_{n-k+1}, \ldots, w_n$ are the k largest items, sorted in the right order.
  - Note that $P(k)$ is vacuously true if $k \geq n$.

Basis: How do we prove $P(1)$? By a nested induction!

This time, take $Q(l)$ to be the statement that, if $l \leq n-1$, then after l iterations of the inner loop, $w_{l+1} > w_j$, for $j = 1, \ldots, l$.

Basis: $Q(1)$ holds because after the first iteration of the inner loop, $w_2 > w_1$ (thanks to the switch statement).

Inductive step: Suppose that $Q(l)$ is true. If $l+1 \geq n-1$, then $Q(l+1)$ is vacuously true. If $l+1 < n$, by $Q(l)$, we know that $w_{l+1} > w_j$, for $j = 1, \ldots, l$ after l iterations. The $(l+1)$st iteration of the inner loop compares w_{l+1} and w_{l+2}. After the $(l+1)$st iteration, the bigger one is w_{l+2}. Thus, $w_{l+2} > w_{l+1}$. By the induction hypothesis, $w_{l+2} > w_j$, for $j+1, \ldots, l$.

That completes the nested induction. Thus, $Q(l)$ holds for all l. $Q(n-1)$ says that $w_n > w_j$ for $j = 1, \ldots, n-1$. That's just what $P(1)$ says. So we're done with the base case of the main induction.

[**Note:** For a really careful proof, we need better notation (for value of w_l before and after the switch).]

Inductive step (for main induction): Assume $P(k)$. Thus, $w_{k+1}, \ldots, w_n$ are the k largest items. To prove $P(k+1)$, we use nested induction again:

- Now $Q(l)$ says "if $i = k+1$, then if $l \leq n-(k+1)$, after l iterations of the inner loop, $w_{l+1} > w_j$, for $j = 1, \ldots, l$."
- Almost the same as before, except that instead of saying "if $l \leq n-1$", we say "if $l \leq n-(k+1)$."
    - If $i = k+1$, we go through the inner loop only $n-(k+1)$ times.

$Q(n-k-1)$ says that, after the $(k+1)$st iteration of the inner loop, $w_{n-k} > w_j$ for $j = 1, \ldots, k$. $P(k)$ says that the top k elements are $w_{n-k+1}, \ldots, w_n$, in that order. Thus, the top $k+1$ elements must be $w_{n-k}, \ldots w_n$, in that order. This proves $P(k+1)$.

Note that $P(n-1)$ says that after $n-1$ iterations of the outer loop (which is all there are), the top $n-1$ elements are $w_2, \ldots, w_n$. So w_1 has to be the smallest element, and $w_1, w_2, \ldots, w_n$ is a sorted list.