

from Monday

def convolution of n -vector a and m -vector b produces $(n+m-1)$ -vector c where

$$c_k = \sum_{i+j=k+1} a_i b_j, \text{ denoted } c = a * b$$

- think of $a * b$ through lens of polynomial multiplication

We see this is analogous

- Ex | $a = (1, 2), b = (-1, 3)$

Find c by thinking of a, b, c as coeff. vectors of polys.

$$a \rightarrow 1 + 2x.$$

Find c by

$$b \rightarrow -1 + 3x$$

$$(1 + 2x)(-1 + 3x)$$

$$= -1 + x + 6x^2$$

$$\text{So } c = (-1, 1, 6)$$

- $a = (a_1, a_2, \dots, a_n) \rightsquigarrow p(x) = a_1 + a_2x + a_3x^2 + a_4x^3 + \dots + a_nx^{n-1}$

$$b = (b_1, \dots, b_m) \rightsquigarrow q(x) = b_1 + b_2x + \dots + b_mx^{m-1}$$

If c is coeff vector of $p(x)q(x)$ then

- c has entries from deg 0 to deg $m+n-2$
So $m+n-1$ entries

- $c_k =$ coeff of x^{k+1} we need to sum all

$$a_i b_j \text{ where } i+j = k+1.$$

Illustrates certain obvious properties

$$a * b = b * a$$

$$a * (b * c) = (a * b) * c$$

$$a * b = 0 \quad \text{if and only if} \quad a = 0 \quad \text{or} \quad b = 0$$

$a * b$ can be represented by matrix-vector product. (!!)

$$a = (1, 2, 3), b = (-1, 2)$$

Let $T(a) = \begin{bmatrix} 1 & 0 \\ 2 & 1 \\ 3 & 2 \\ 0 & 3 \end{bmatrix}$. Then $a * b = T(a) \cdot b = c$

Toeplitz \swarrow

4×2 \swarrow 2×1 \swarrow 4×1

$$\begin{bmatrix} 1 & 0 \\ 2 & 1 \\ 3 & 2 \\ 0 & 3 \end{bmatrix} \begin{bmatrix} -1 \\ 2 \end{bmatrix} = \begin{bmatrix} +1(-1) + 0 \\ 2(-1) + 1(2) \\ 3(-1) + 2 \cdot 2 \\ 0(-1) + 3 \cdot 2 \end{bmatrix} = \begin{bmatrix} -1 \\ 0 \\ 1 \\ 6 \end{bmatrix}$$

You find $T(b)$ so that $a * b = T(b)a$

$$\begin{bmatrix} -1 & 6 & 0 \\ 2 & -1 & 0 \\ 0 & 2 & -1 \\ 0 & 0 & 2 \end{bmatrix} \begin{bmatrix} 1 \\ 2 \\ 3 \end{bmatrix} = \begin{bmatrix} -1 \\ 0 \\ 1 \\ 6 \end{bmatrix}$$

* So polynomial expansion can be modeled by matrix-vector product.

* Convolution appears when studying time series

$x = (x_1, x_2, \dots, x_n)$ is a time series means x_i 's are the same type of measurement over time (typically equal intervals).

- high temp in Fbks each day for 50 yrs
- height of human each year for 50 years
- conc. of drug in bloodstream each min for 24 hrs
- audio signal over 17 sec.

Ex Say $x =$ ^{daily} high temps in Fbks for 10 consec. years
So x is 3650-vector.

Say $a = (\frac{1}{3}, \frac{1}{3}, \frac{1}{3})$.

What is $a * x$? \Rightarrow notation/math \Rightarrow wordy explanation

math: c is a $3650+3-1=3652$ -vector

(mostly) ↗

$$\text{if } 3 \leq k \leq 3650 \quad c_k = \frac{1}{3}(x_{k-2} + x_{k-1} + x_k)$$

(little exceptions)

$$c_1 = \frac{1}{3}x_1, \quad c_2 = \frac{x_1 + x_2}{3}, \quad c_{3651} = \frac{x_{3650} + x_{3649}}{3}$$

$$c_{3652} = \frac{1}{3}x_{3650}$$

Words: c is the average high for
previous 3 days. So c is a
"running average."

Smooths the data set.

Input-output systems or

System-impulse response

- high temps in AK range (input)
high river levels in Tanana (output)
③ Flaks

- change in human behavior due to covid.

- rainfall + river height

x = rainfall in inches each day

y = inches above normal

↑ river height in
 $h = (0, 1, 2)$

Input $x = (0, 4, 0, 0, \dots)$

Find and output $y = h * x$.

$$\begin{array}{l} 1 - \\ 2 - \\ 3 - \\ 4 - \\ 5 - \end{array} \begin{bmatrix} 0 & 0 & 0 & \vdots \\ 1 & 0 & 0 & \vdots \\ 2 & 1 & 0 & \vdots \\ 0 & 2 & 1 & \vdots \\ \vdots & \vdots & 0 & 2 & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots \end{bmatrix} \begin{bmatrix} 0 \\ 4 \\ 0 \\ 0 \\ \vdots \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 4 \\ 8 \\ 0 \\ \vdots \end{bmatrix}$$

⁴ⁱⁿ
rains on day²,
on day³, river is
4in above
on day⁴, river is
8in above
on day⁵, back to normal