

# Digital Image Processing

## Lecture 9: Unitary Image transforms

$M \geq n \geq 0$

$$[M]_{n \times n} \xrightarrow{\text{unitary transform}} [V]_{n \times n} = [U]_{n \times n}^{-1} [D]_{n \times n} [U]_{n \times n}$$

General Image transforms (other than the DFT)

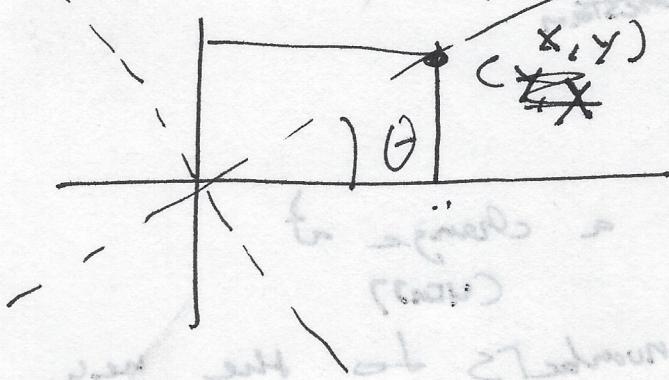
think of a change

of basis

$$\text{matrix } A = V_{n \times n} U_{n \times n}$$

In 2D, A Rotation is Like a change of basis of the Coordinate System

$$\begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix} \begin{bmatrix} X \\ Y \end{bmatrix}$$



describe by new

coordinate, no info is lost in this manner

Go to higher dimensional from 2D

- Create a unitary transform

(2)

## UNITARY TRANSFORM

from 22nd Jan 2009 - 8pm lotipit

$v[k] = \sum_{n=0}^{N-1} a[k,n] u[n]$        $0 \leq k \leq N-1$

$\uparrow$                            $\uparrow$   
att. out OUTPUT      input

emphasized protein if output  
emphasized input however

fairly way of working matrix multiplications

$$V_{N \times 1} = A_{N \times N} u_{N \times 1}$$

attend to

so what's a unitary?  $A^T$  is it?

what makes a transform unitary?

matrix  $A$  standard out to stand  
unitary       $\leftarrow$  conjugate

$$A^{-1} = (A^T)^*$$

$$= A^H \leftarrow A \begin{array}{l} \text{Hermitian} \\ \text{permutation} \end{array}$$

Idea,  $A$  represents a change of basis from the old  $n$  numbers to the new

"numbers that represent  $v$ "

new basis  $\rightarrow$  start -

Ex:

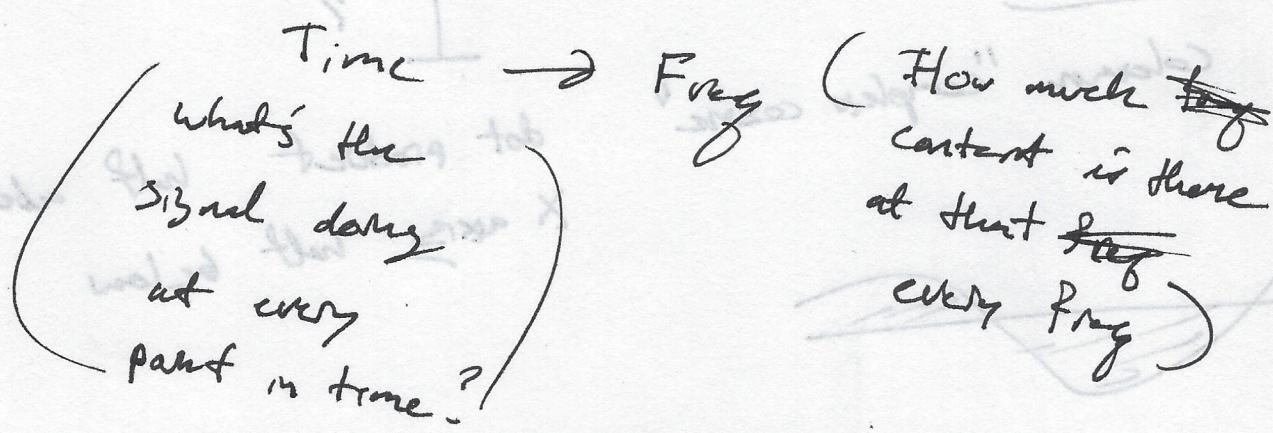
$$A = \begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix} \begin{bmatrix} \cos\theta & \sin\theta \\ -\sin\theta & \cos\theta \end{bmatrix}$$

$$= \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$

AA<sup>T</sup> = I      unitary  
Property satisfied

columns of A are unit length and perp to each other

DFT is like a change of basis



(N: ID, we also have the discrete Fourier Transform Basis)

$$F[k] = \sum_{n=0}^{N-1} f[n] e^{-j \frac{2\pi k n}{N}}$$

or A, B

$$A(k,n) = e^{-j \frac{2\pi k n}{N}}$$

think "Fourier Matrix"

(4) make  $A$   $N \times N$  matrix out of these exp.

$$\begin{bmatrix} \theta_{11} \\ \theta_{21} \end{bmatrix} \quad \begin{bmatrix} \theta_{12} & \theta_{22} \end{bmatrix}$$

$$A = \begin{bmatrix} \theta_{11} & \theta_{12} \\ \theta_{21} & \theta_{22} \end{bmatrix}$$

$$F = A f_K$$

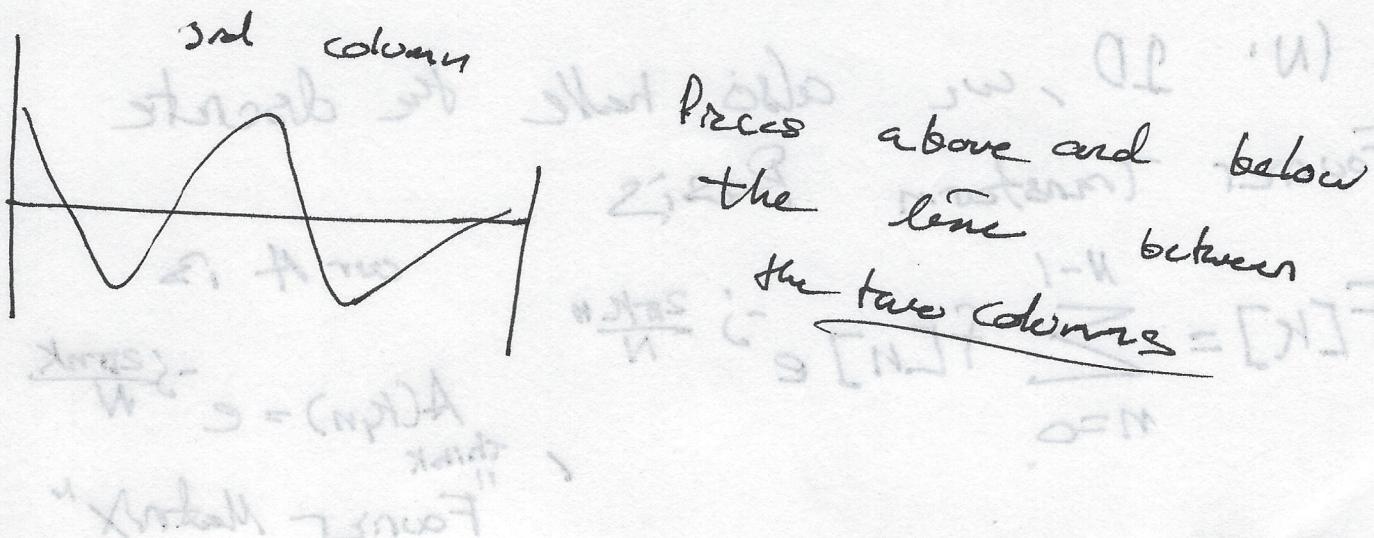
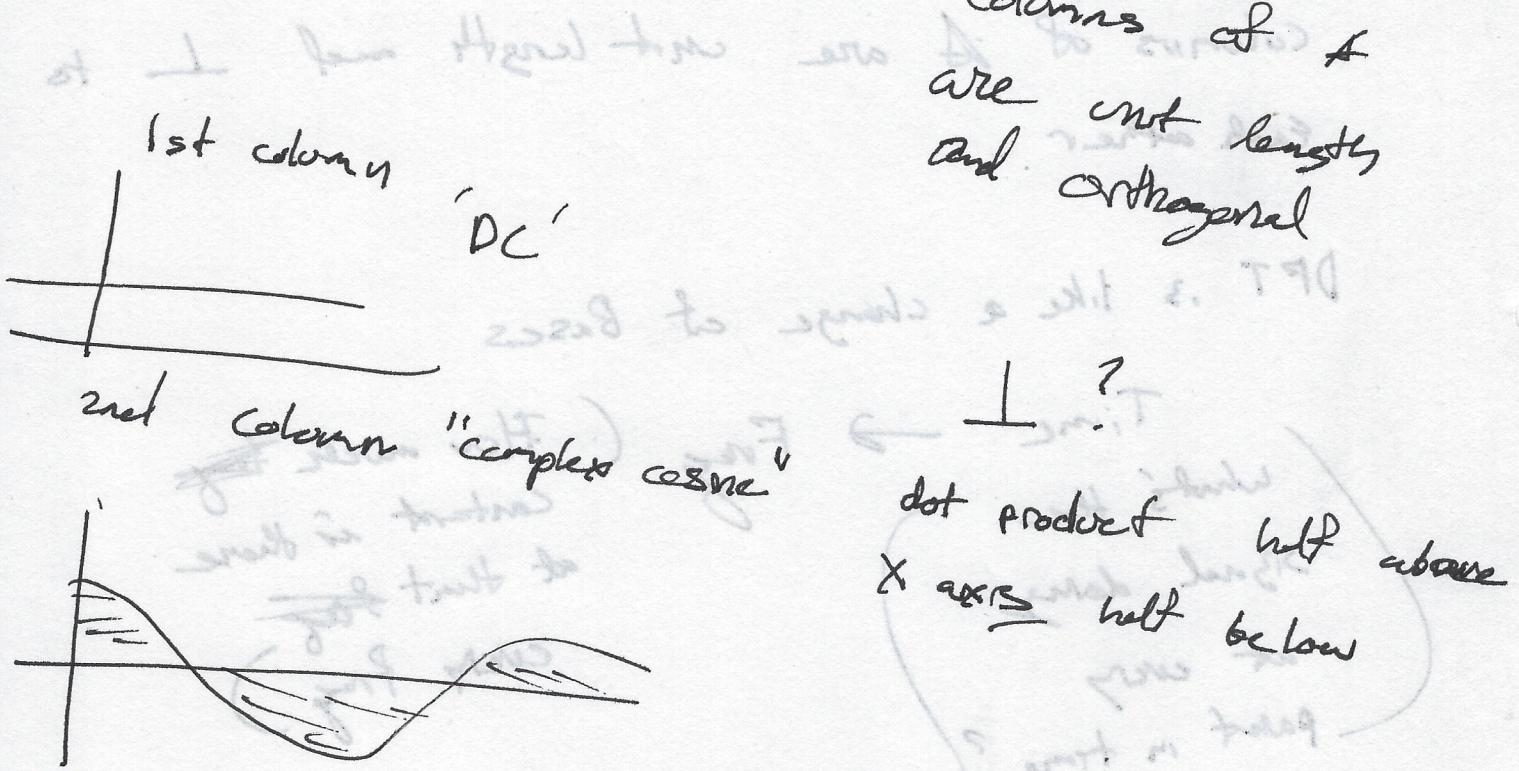
Input signal  $f_K$

Output  $\rightarrow$   $I = TAA^T$

$N \times N$  Fourier matrix

length  $\rightarrow$  complex exponential

columns of  $A$   
are unit length  
and orthogonal



Extra: In Image Processing, we have

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The spectral basis

$$\begin{bmatrix} \text{Image} \\ \vdots \\ \vdots \end{bmatrix} = \begin{bmatrix} \text{Basis} \\ \vdots \\ \vdots \end{bmatrix} \cdot \begin{bmatrix} 1 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} + \begin{bmatrix} \text{Basis} \\ \vdots \\ \vdots \end{bmatrix} \cdot \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} + \dots = (K \times I)$$

AND The DFT Basis

$$\begin{bmatrix} \text{Image} \\ \vdots \\ \vdots \end{bmatrix} = F[0,0] \cdot \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix} + F[1,0] \cdot \begin{bmatrix} \text{Basis} \\ \vdots \\ \vdots \end{bmatrix} + \dots$$

$$+ F[g_1] \cdot \begin{bmatrix} \text{Basis} \\ \vdots \\ \vdots \end{bmatrix} + \dots$$

$$2-D \text{ DFT} \quad F[u,v] = \sum_{x=0}^{M-1} \sum_{y=0}^{N-1} f(x,y) e^{-j\left(\frac{2\pi u x}{M} + \frac{2\pi v y}{N}\right)}$$

$M \times N$   
output  
image

$$= A_M f A_N$$

$M \times M \quad M \times N \quad N \times N \quad \text{DFT Matrix}$   
 $\text{DFT Matrix}$

2D unitary  
Transformation

$$(M \times M)(N \times N)(N \times N) = M \times N$$

## ⑥ SPATIAL Basis

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}, \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}, \begin{bmatrix} 0 & 0 & 1 \\ 1 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$$

$$I(x,y) = \frac{I(1,1)B_{11}}{\text{Scalars}} + I(1,2)B_{12} + \dots$$

↑  
2D matrix

How is the image made up of contribution from these matrices?

## Fourier Basis

$$\begin{bmatrix} \quad \end{bmatrix}, \begin{bmatrix} \quad \end{bmatrix}$$

DC matrix

DC in X, single cos in Y

$$\begin{bmatrix} \frac{1}{\sqrt{N}} & \dots & \dots \\ \dots & \dots & \dots \end{bmatrix}$$

DC in Y, single in X cosine

$\Rightarrow E(x) \rightarrow \begin{bmatrix} 1 & \dots & 1 \end{bmatrix} = [v, v]$

$$I(x,y) = C_{11}(\text{DC}) + C_{12}($$

view as  
matrix

8x8 image 13:00

1000 190 1000 1000 1000 1000

$U \times M = (U \times N)(V \times N)(V \times M)$

Snow basis Matlab 16:00

'spatial'

(190 w/ 320) 17:30

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Real Part of DFT

17:25

18:47

Not a lot of High freq. stuff,

if it was checkered Board, then  
Perhaps a lot of High Freq.

- almost no higher frequency  
material and zero highest

frequency  $\rightarrow$  more below 2, most > 2 no)  
(large low) spars.

\* A lot of contribution from Low freq and DC

Image compression gets rid of the Low freq stuff

Not need, as we can reconstruct the image mostly and  
Sufficiently with the low freq and DC terms.

A unitary transform satisfies

$$\sum_x \sum_y (f[x,y])^2 = \sum_u \sum_v (F[u,v])^2$$

i.e. signal energy is preserved (Parseval)

$\rightarrow$  CAN SAVE 99% of the image energy via the DFT  
world over the DC terms in the spectral world.

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Over-diffusion

closed walk

## 2D DFT: (Pros & the DFT)

'Inverse'

FH:81

25.51

Pros:

- Energy is packed usually into Low frequency coefficients
- Convolution Property (LTI systems)
- Fast (FFT) Implementations

Cons

- Transform is complex even for a real image (real signal)

- The Basis functions span IMAGE

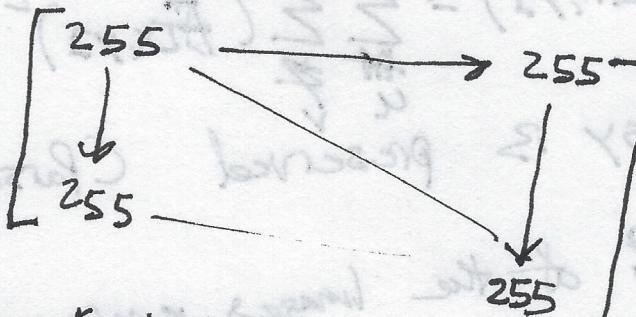
HEIGHT / WIDTH

Say we have an image

$$\begin{bmatrix} 10000 & \dots \\ G & \\ G & \\ G & \\ \vdots & G \end{bmatrix}$$

Impulse in time domain is a constant in the frequency domain

and show basis has



Isolated in Spatial Domain

- Need a lot of Frequency Coefficients to describe it