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BASIC PRINCIPLES OF FOURIER THEORY (M.F. Moody)

- Some history.
- What is a Fourier transform (F.T.)?
- Working with F.Ts.: 1D curves.
- Fourier analysis of 2D images.

# Early History of Fourier Transforms & Image Processing.

- 1810: Fourier invented F.Ts. for heat conduction problems.
- 1873: Abbe applied them to image formation in the microscope.
- 1939: Bragg applied them to X-ray crystallography.
- 1949: Lipson produced them with the optical diffractometer.

- 1964: Klug & Berger used optical diffractometer on electron micrographs.
- 1965: Cooley & Tukey reinvented Fast Fourier Transform (Gauss, 1805) for computers.
- 1968: DeRosier & Klug used computed F.Ts. for 3-D reconstruction.
- 1971: Erickson & Klug used them for **defocus correction**.



# WHAT IS A FOURIER TRANSFORM (F.T.)?

- Fourier series of repeating (periodic) curves.
- Curve represents light passing through transparency: it has brightness and phase.
- Fourier transforms of non-repeating curves (also with brightness and phase).

#### Periodic Curves & Fourier Series.



#### Fourier Series is Reversible.



- 3 peaks can reconstitute essentials of curve.
- Remaining "peaks" are just noise.
- So ignoring them = **data-compression**.

## Representing Fourier Series.



# Representation when Curve has Phase as well as Amplitude.

- Light wave has amplitude and **phase**.
- Optical diffractometer gives its F.T.
- This has negative as well as positive axis.



#### Fourier analysis of non-periodic curves.



- Repeating curve gives Fourier series with 4 peaks.
- Take part of curve and repeat it with gaps between.
- This gives Fourier series with more (& closer) peaks.
- Increase size of gaps until only the central curve exists.
- Then the "peaks" of the Fourier "series" are continuous.
- This gives us the Fourier transform.

#### Fourier series and F.Ts.

- Fourier series: real-space curve is continuous, reciprocal-space Fourier series is discontinuous (peaks).
- Fourier transform: real-space curves is continuous, reciprocal-space F.T. is also continuous.
- Fourier transforms can be obtained in the optical diffractometer.
- But (strictly) neither the Fourier series nor the F.T. is obtainable with a computer.

# WORKING WITH FOURIER TRANSFORMS (F.Ts.).

- Reversing F.Ts.
- Rules for 1D F.Ts.
- Examples of 1D F.Ts.
- Rules for 2D F.Ts.: the 3 pairs of rules.
- Examples of 2D F.Ts.

#### Reversing F.Ts.

- F.T. extends to infinity, so it needs truncation before reversing it.
- Outer parts relate to finer details, so eliminate details that are artefacts or noise.

- How to reverse F.T.?
- Simply take a second
  F.T., and then rotate it
  by 180 degrees.

### 1<sup>st</sup>. Rule for 1D F.Ts.: Stretching.



#### 2<sup>nd</sup>. Rule for 1D F.Ts.: Addition.

Sum of Fourier components = (cleaned) O.D. curve:



## 3<sup>rd</sup>. Rule for 1D F.Ts.: Multiplication.

- Multiplication by a constant → multiplication of F.T. by a constant (*follows from addition rule*).
- Multiplication of 2 images → convolution of 2 F.Ts.
- This means that the first F.T. acts as the "laser beam" generating the second F.T.
- Example when first F.T. = set of peaks:-

# 1D F.T. of infinite equidistant peaks.



# 1D Convolution.



- Curve multiplied by infinite set of peaks, giving 9 peaks of "sampled" curve.
- F.T. gets convoluted by F.T.(peaks), *i.e.* by the reciprocal set of peaks.

# 4<sup>th</sup>. Rule for 1D F.Ts.: translation (shift) only changes F.T. phases.

- Moving an image doesn't change it, so it still needs the same component density-waves to construct it.
- Therefore translation (shift) doesn't affect F.T. amplitudes.
- Therefore the translation only changes the **phases** of its component density-waves.
- A high-frequency density-wave must move as far as one of low-frequency; but its wavelength is shorter, so its proportional shift (i.e. its phaseshift) must be bigger.

# Translating a single peak.







 Peak shifted from origin needs cosine waves with phase proportional to frequency.

### Translating an image.



1D F.T.: "rectangle" function.





#### 1D F.T.: "triangle" function.



### 1D F.T.: Gaussian function.

![](_page_23_Figure_1.jpeg)

## How much information in a F.T.?

- F.Ts. are smooth functions, so they are somewhat predictable.
- By the scale theorem, the smaller an image, the more stretched its F.T., so the more predictable it is.
- Being predictable, an F.T. carries a limited amount of information per unit of reciprocal space.
- How limited is this information?

# Sampling theorem.

![](_page_25_Figure_1.jpeg)

![](_page_25_Figure_2.jpeg)

![](_page_25_Figure_3.jpeg)

![](_page_25_Figure_4.jpeg)

![](_page_25_Figure_5.jpeg)

# Lessons of sampling theorem.

- The F.T. of a curve of width *D* can be rebuilt accurately from its values sampled at points 1/*D* apart.
- Thus these few sampled values carry all the information in the F.T.
- The F.T. of a curve of width *D* consists of "lumps" of substantial amplitude that are roughly 1/*D* in size.

#### Fourier analysis of 2D images.

![](_page_27_Figure_1.jpeg)

## 2D convolution.

![](_page_28_Picture_1.jpeg)

#### 2D F.Ts.: translation.

![](_page_29_Figure_1.jpeg)

#### 2D F.Ts.: 3 pairs of rules.

ALGEBRAIC

Linearity  $\pm \quad \pm \quad \pm$ 

Convolution  $x \checkmark \checkmark \times$ 

#### ISOMETRIC MOVEMENT

![](_page_30_Picture_5.jpeg)

#### DISTORTION

Scale

<//>

Projection

![](_page_30_Picture_10.jpeg)

![](_page_31_Figure_0.jpeg)

## 2D F.Ts.: parallel lines.

![](_page_32_Figure_1.jpeg)

#### 2D F.Ts.: Projection Theorem.

![](_page_33_Figure_1.jpeg)

#### 2D F.Ts.: 3 pairs of rules.

ALGEBRAIC

Linearity  $\pm \quad \pm \quad \pm$ 

Convolution  $x \checkmark \checkmark \times$ 

#### ISOMETRIC MOVEMENT

![](_page_34_Picture_5.jpeg)

#### DISTORTION

Scale

<//>

Projection

![](_page_34_Picture_10.jpeg)

![](_page_35_Figure_0.jpeg)

## 2D F.Ts.: parallel lines.

![](_page_36_Figure_1.jpeg)

#### 2D F.Ts.: square lattice.

![](_page_37_Figure_1.jpeg)