





# Fourier Transforms

# Topics

I. Why you want one.

II. What it tells you.

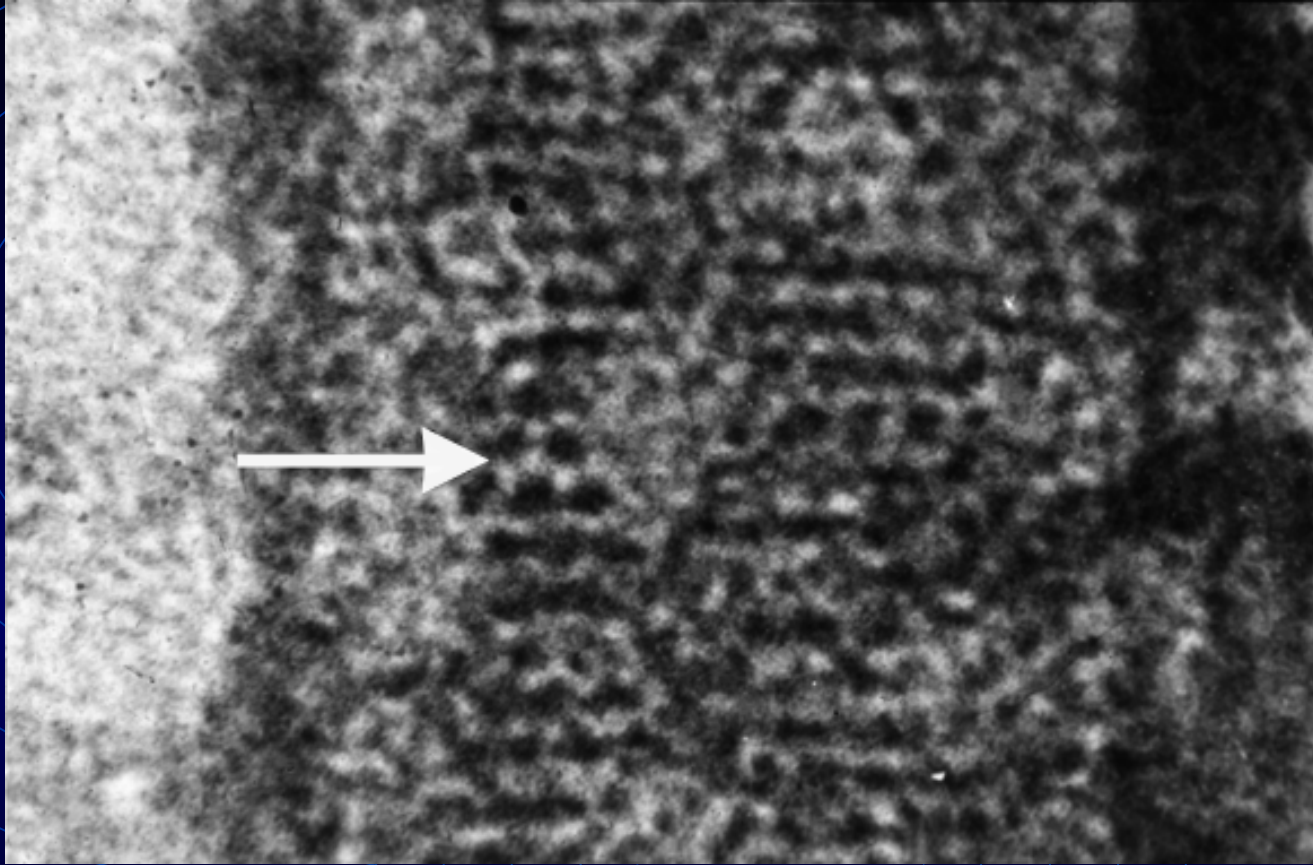
III. How to think about them.

IV. How to get one.



I. Why you want one.

A helical tube of virus head protein.

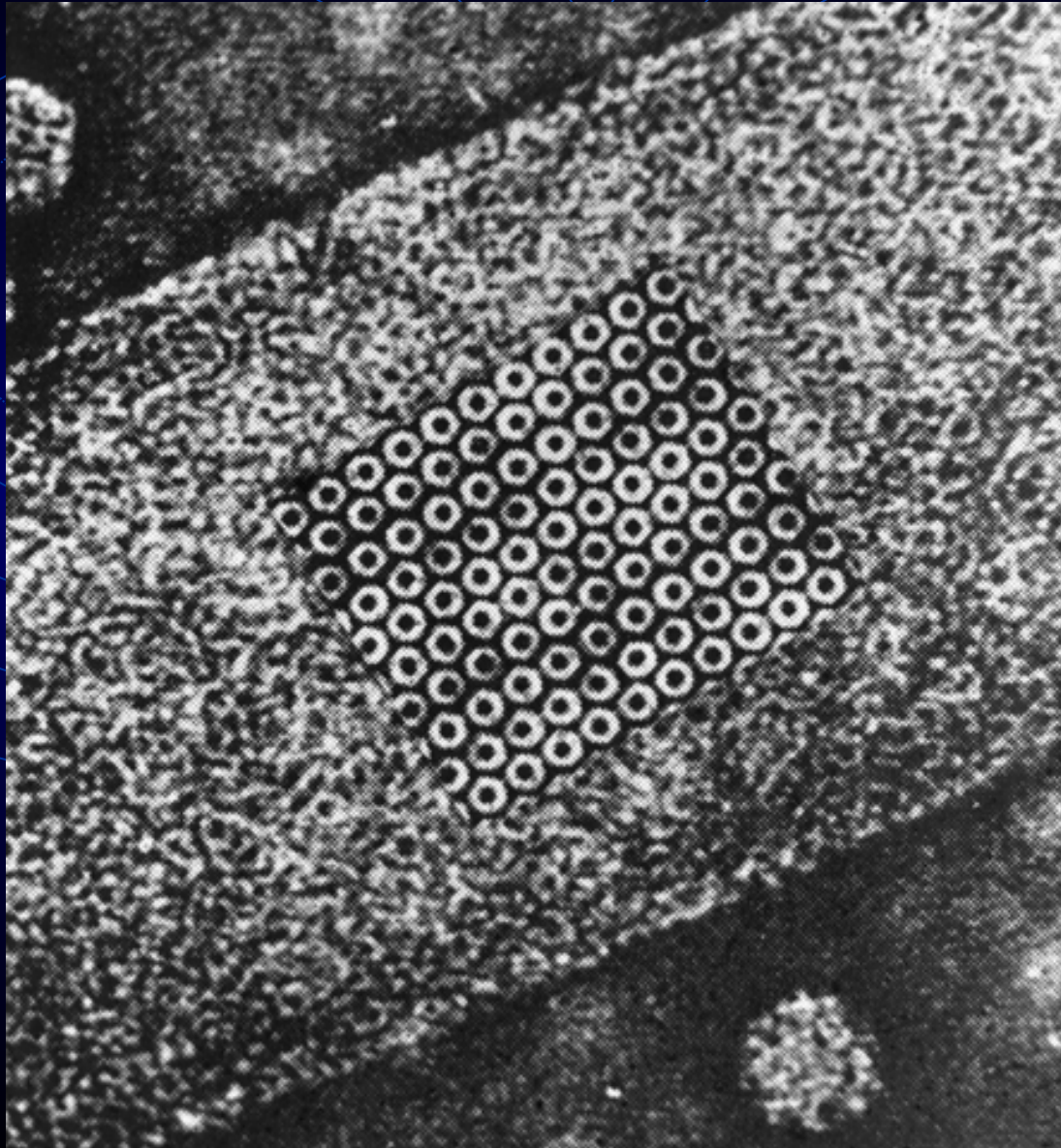


The protein subunits can be seen clearly in some places but not others.

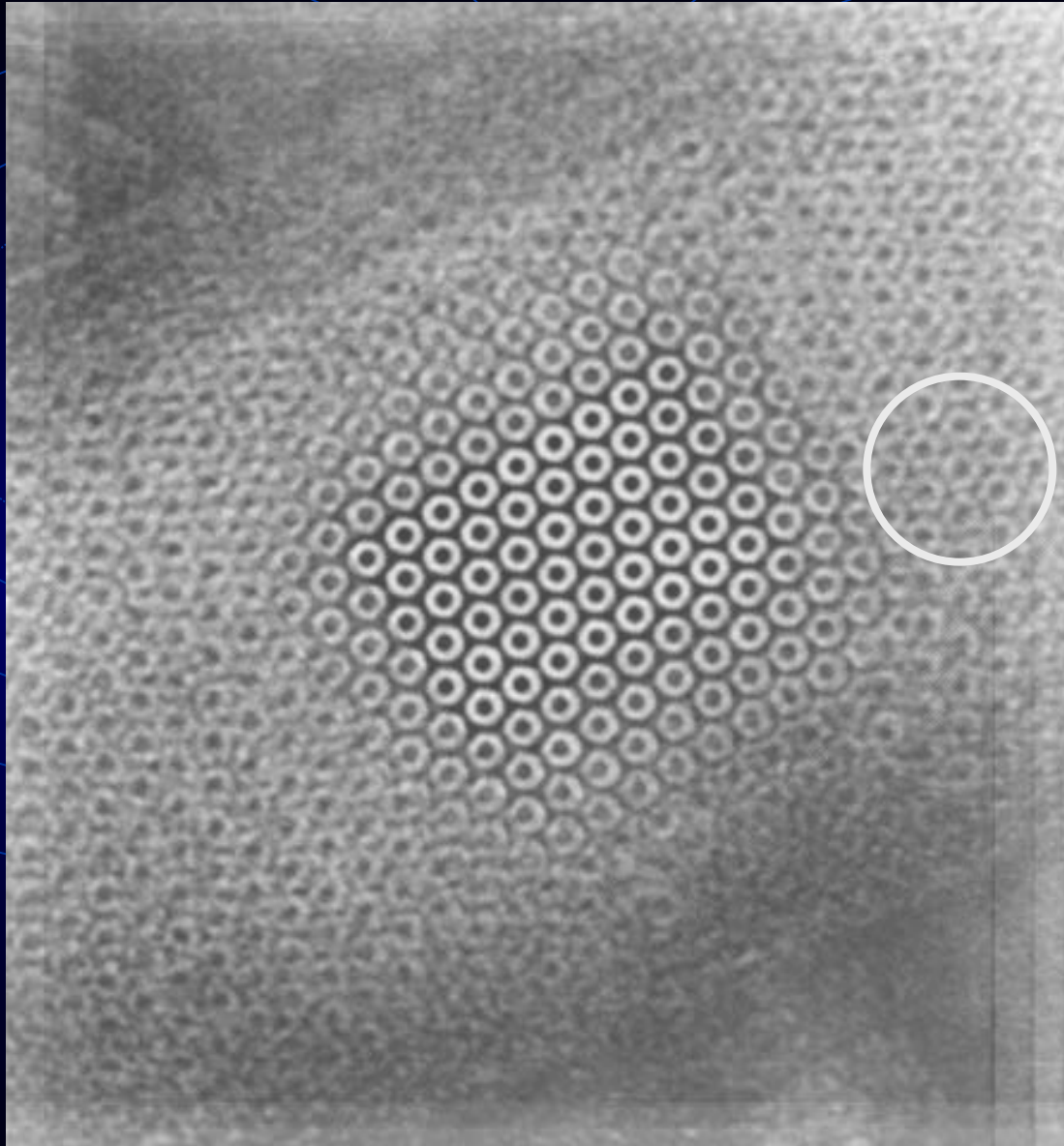
Although we see some regularities, they are not everywhere.

Is this simply a bad image?

Photographic image superposition (averaging) by Roy Markham.  
The image is shifted and added to the original.



Superimposed images using Adobe Photoshop.



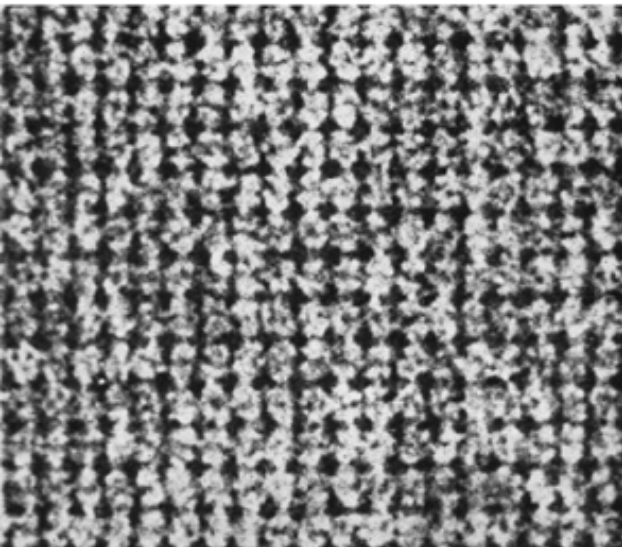
I used Markham's lattice to determine how much to shift by.

How would I figure out the distance and direction to shift if there weren't a guide?

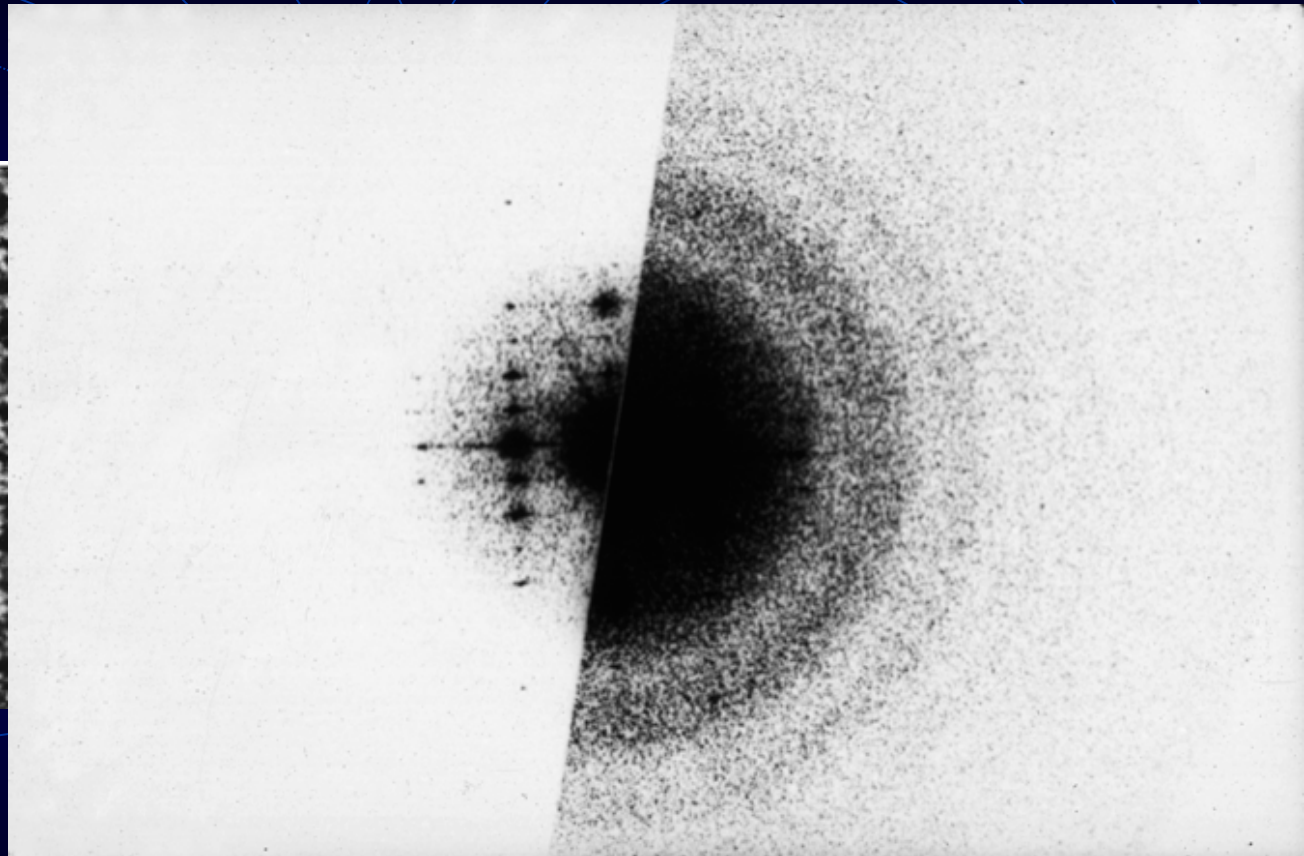
1. I could guess and pick the answer (image) that I liked best.
2. I could try all possible shifts and pick out the image with the strongest features (measured objectively rather than subjectively).

The Fourier transform carries out the essence of method 2.



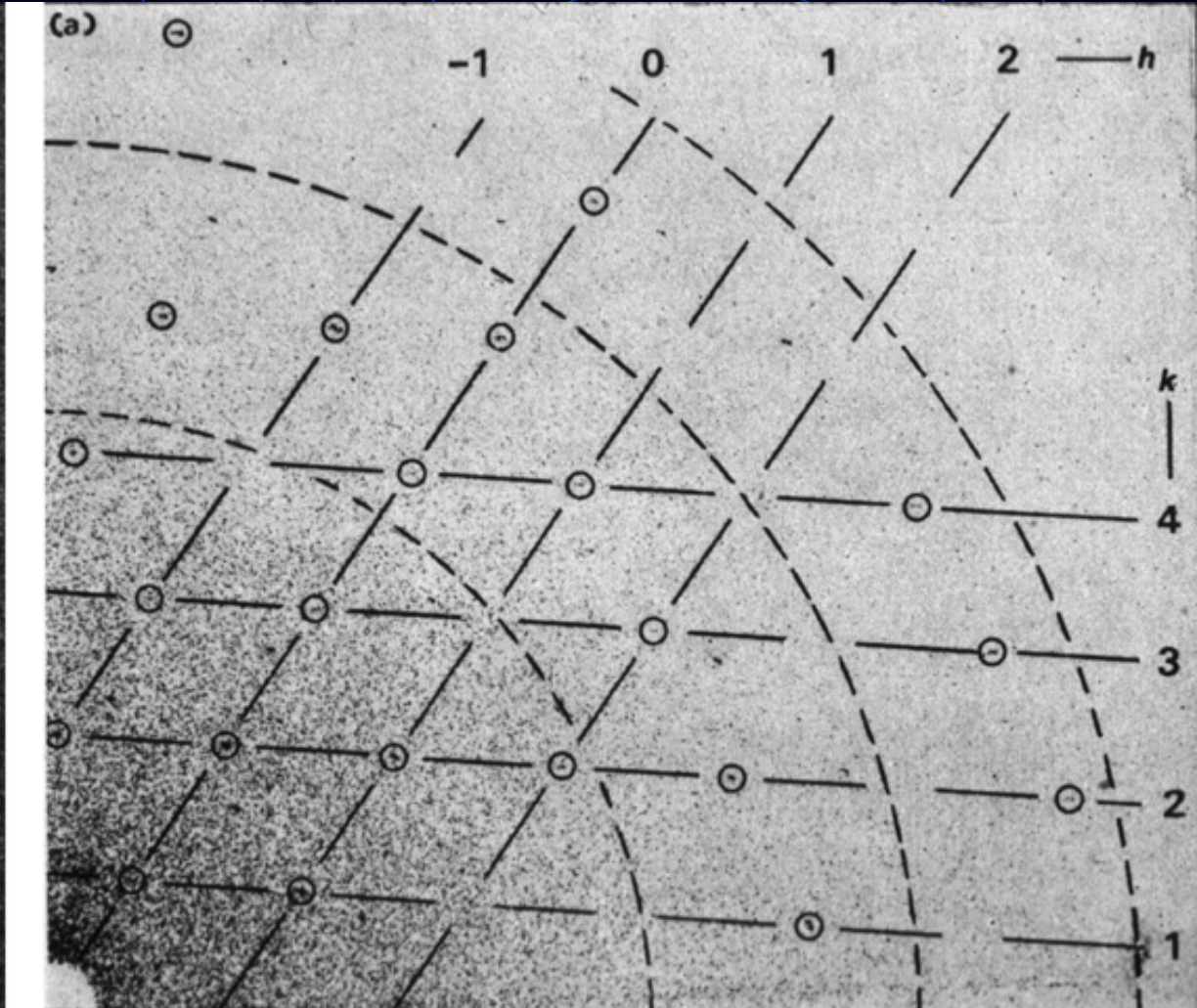


EM of catalase



Optical diffraction pattern weak and strong exposure.

(Erikson and Klug, 1971)



Bacterial rhodopsin in glucose

Fourier transform of image.



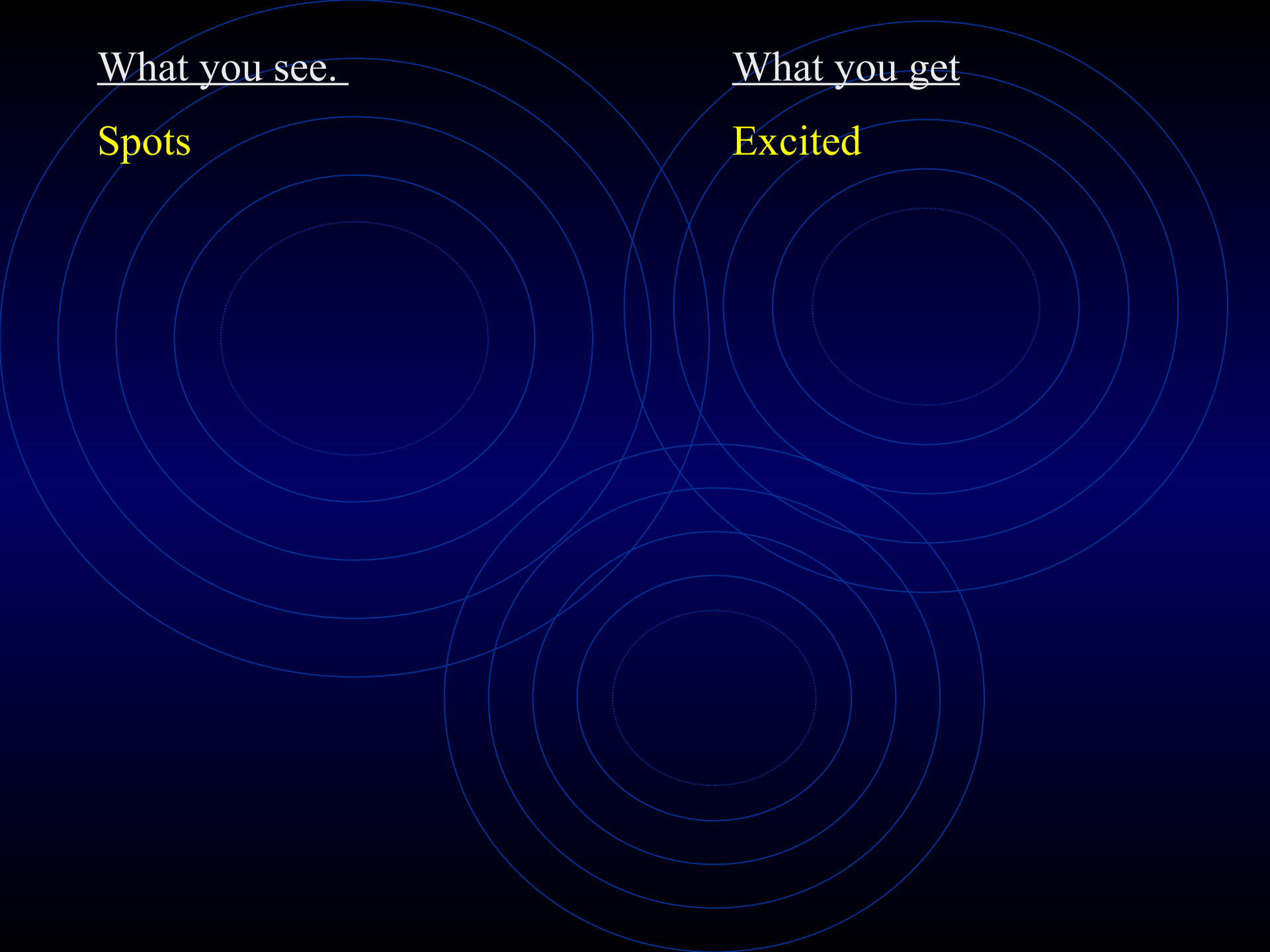
# II. What the Fourier transform tells you.

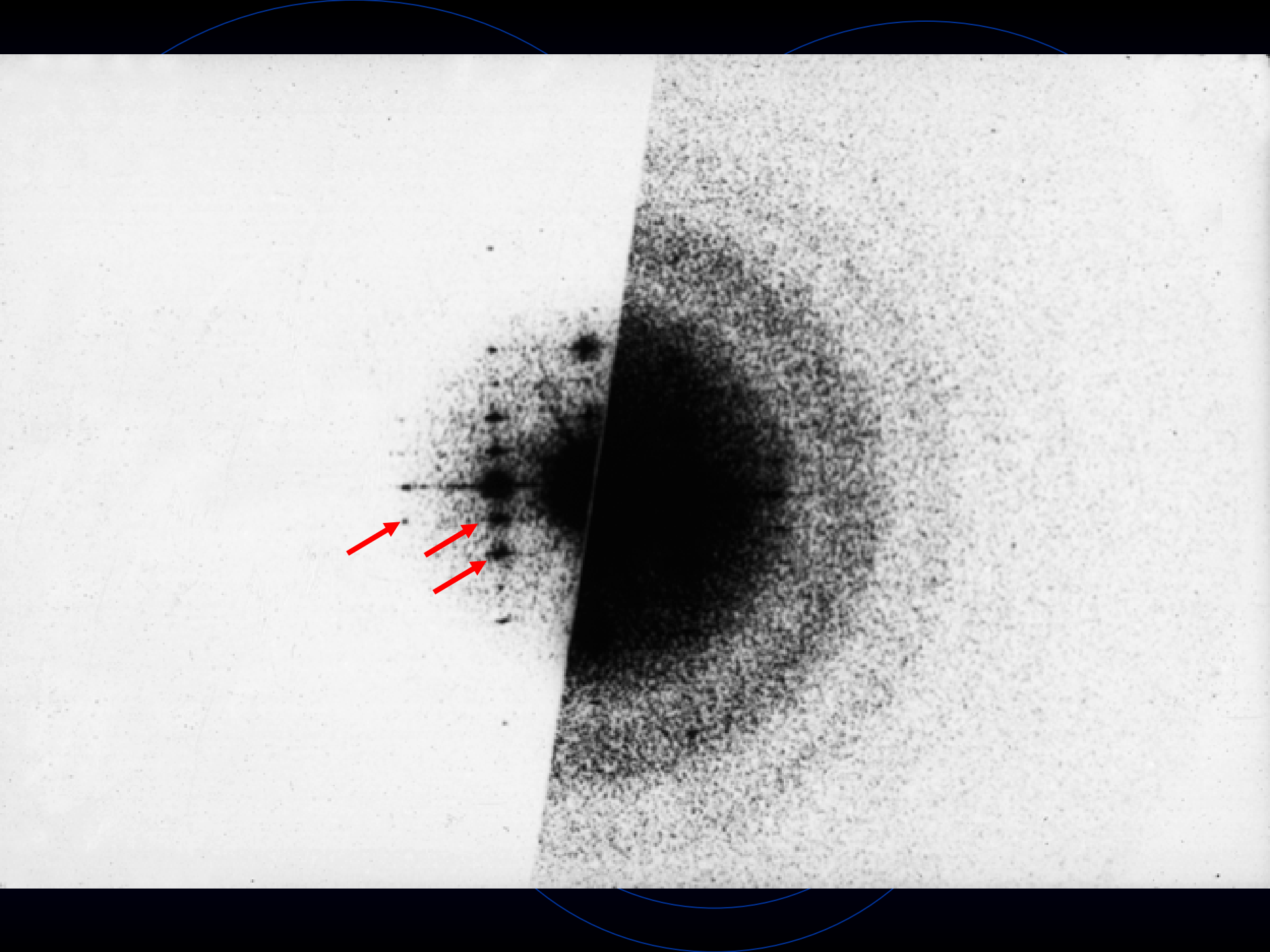
What you see.

**Spots**

What you get

**Excited**





What you see.

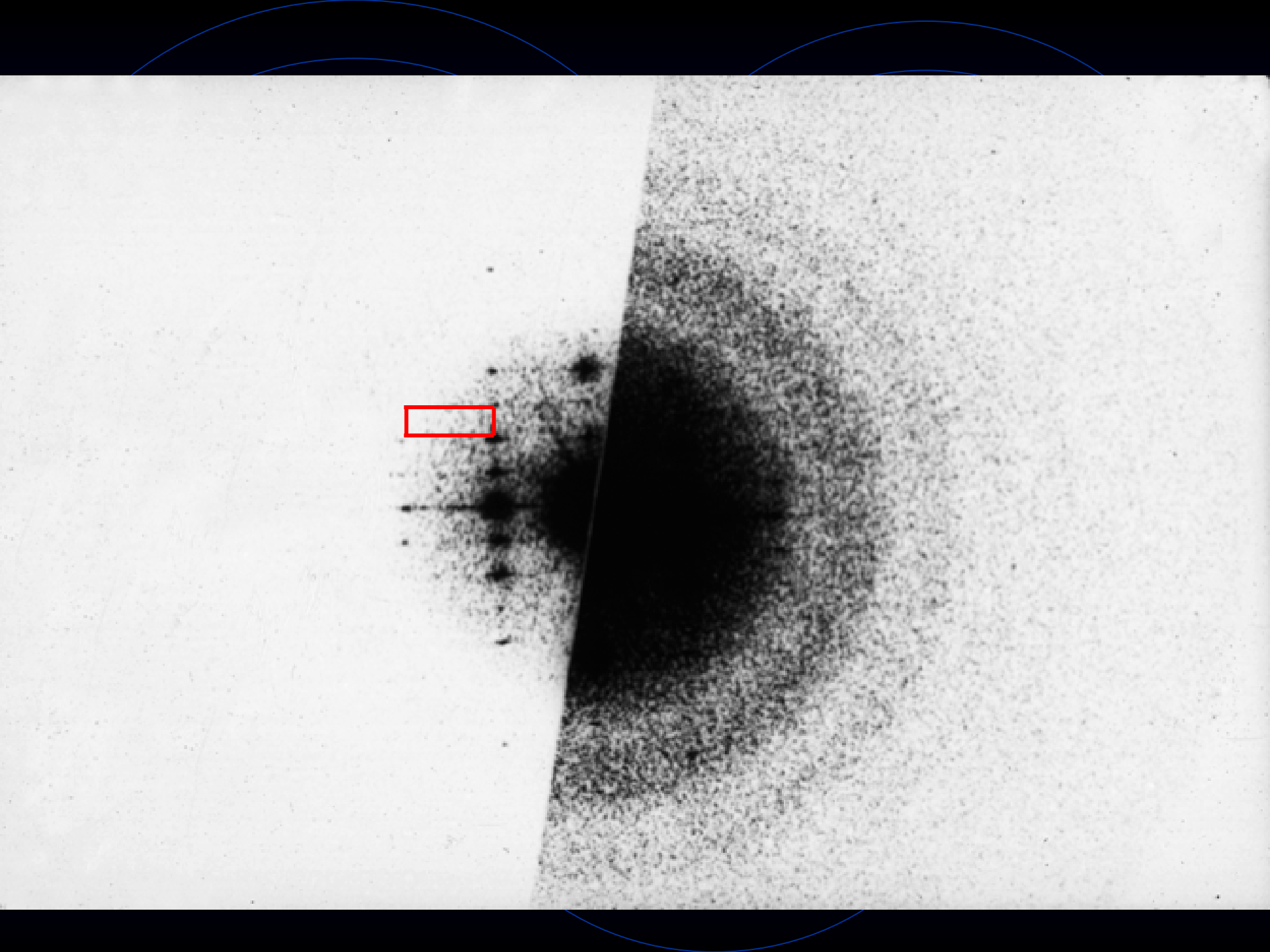
Spots

Spot positions

What you get

Excited

Unit cell size and shape



What you see.

Spots

Spot positions

**Spot size**

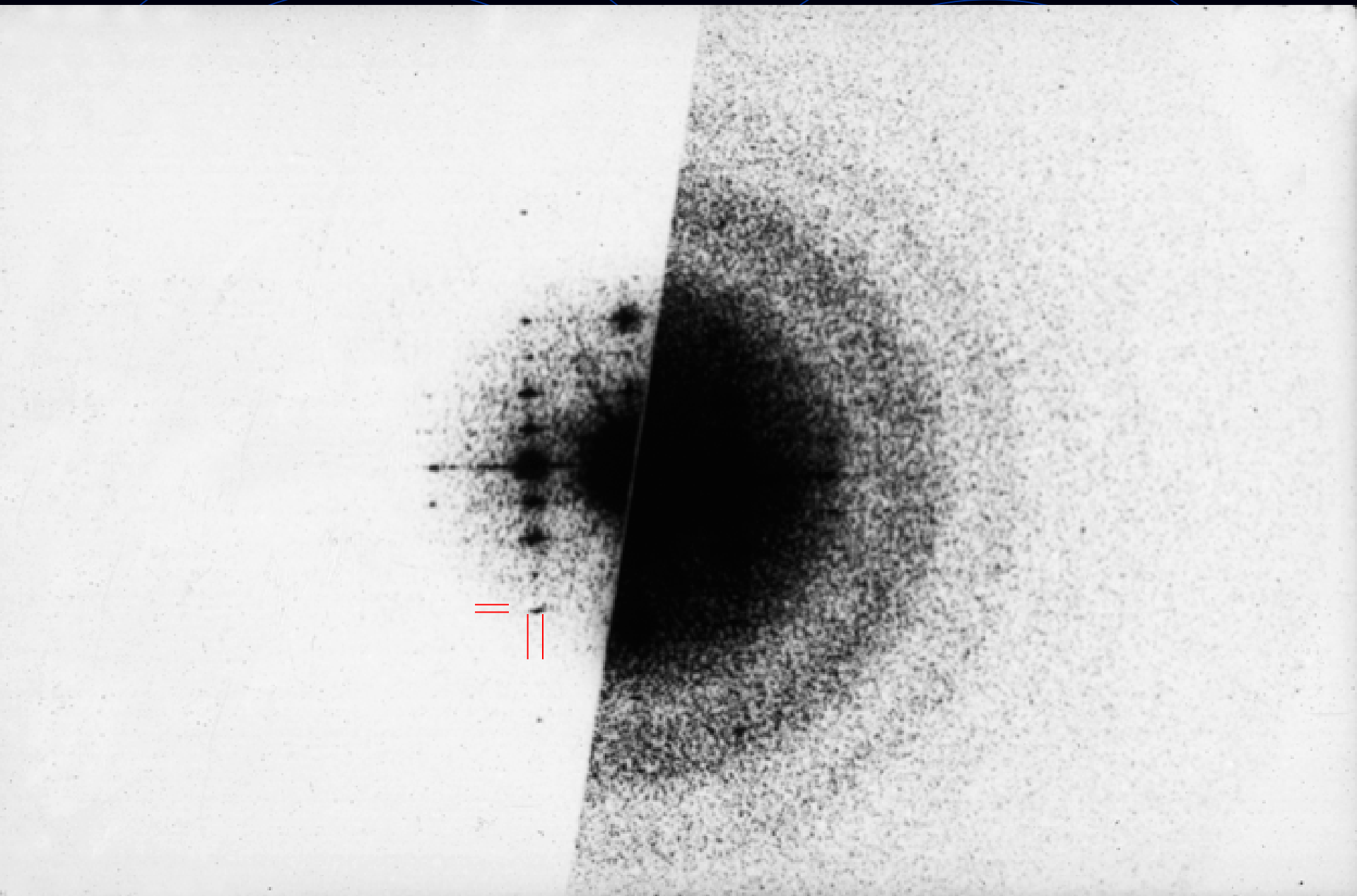
What you get

Excited

Unit cell size and shape

**Size of coherent domains**





What you see.

Spots

Spot positions

Spot size

**Intensity relative to background**

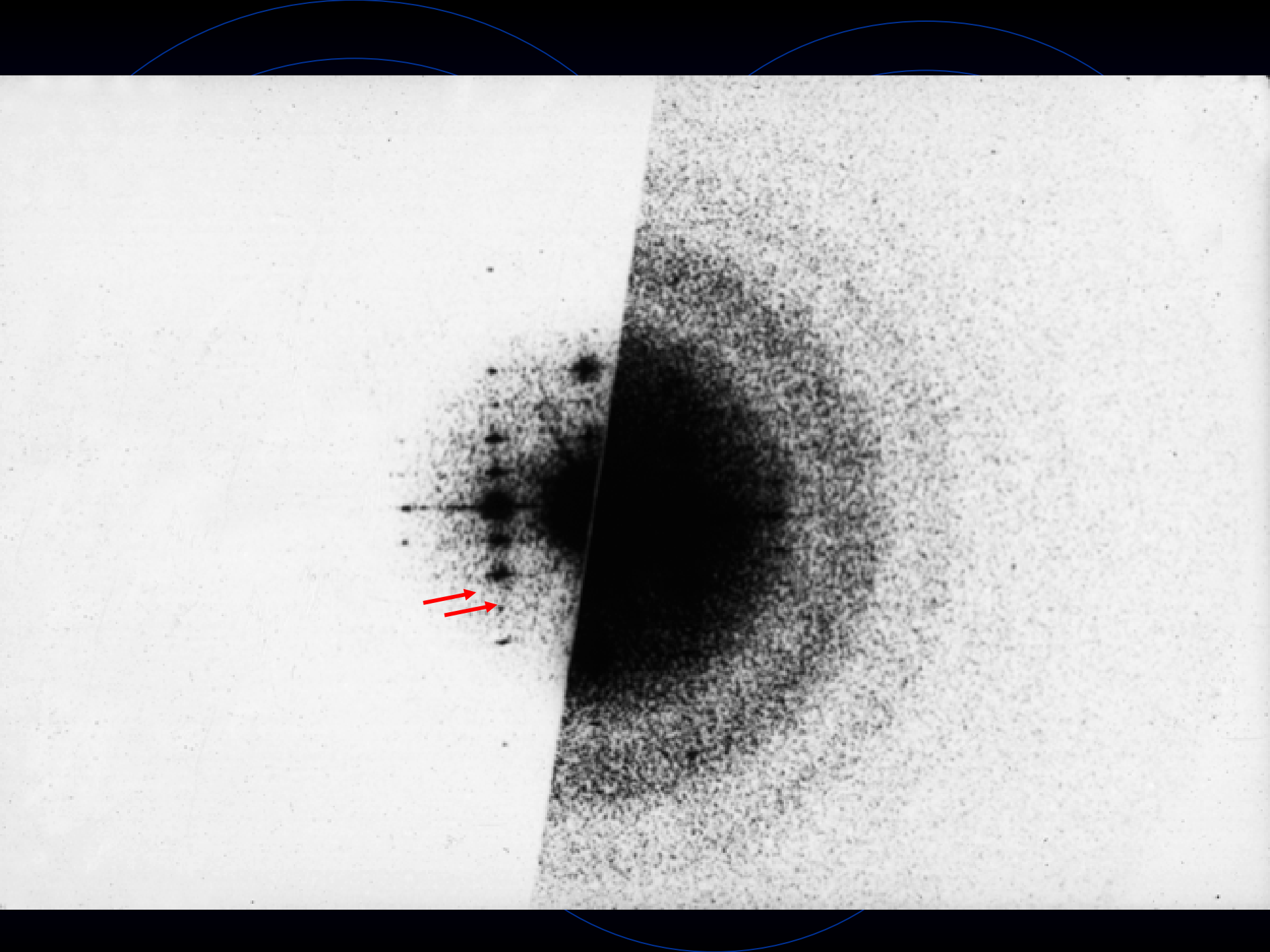
What you get

Excited

Unit cell size and shape

Size of coherent domains

**Signal/noise ratio**



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

**Distance to farthest spot**

What you get

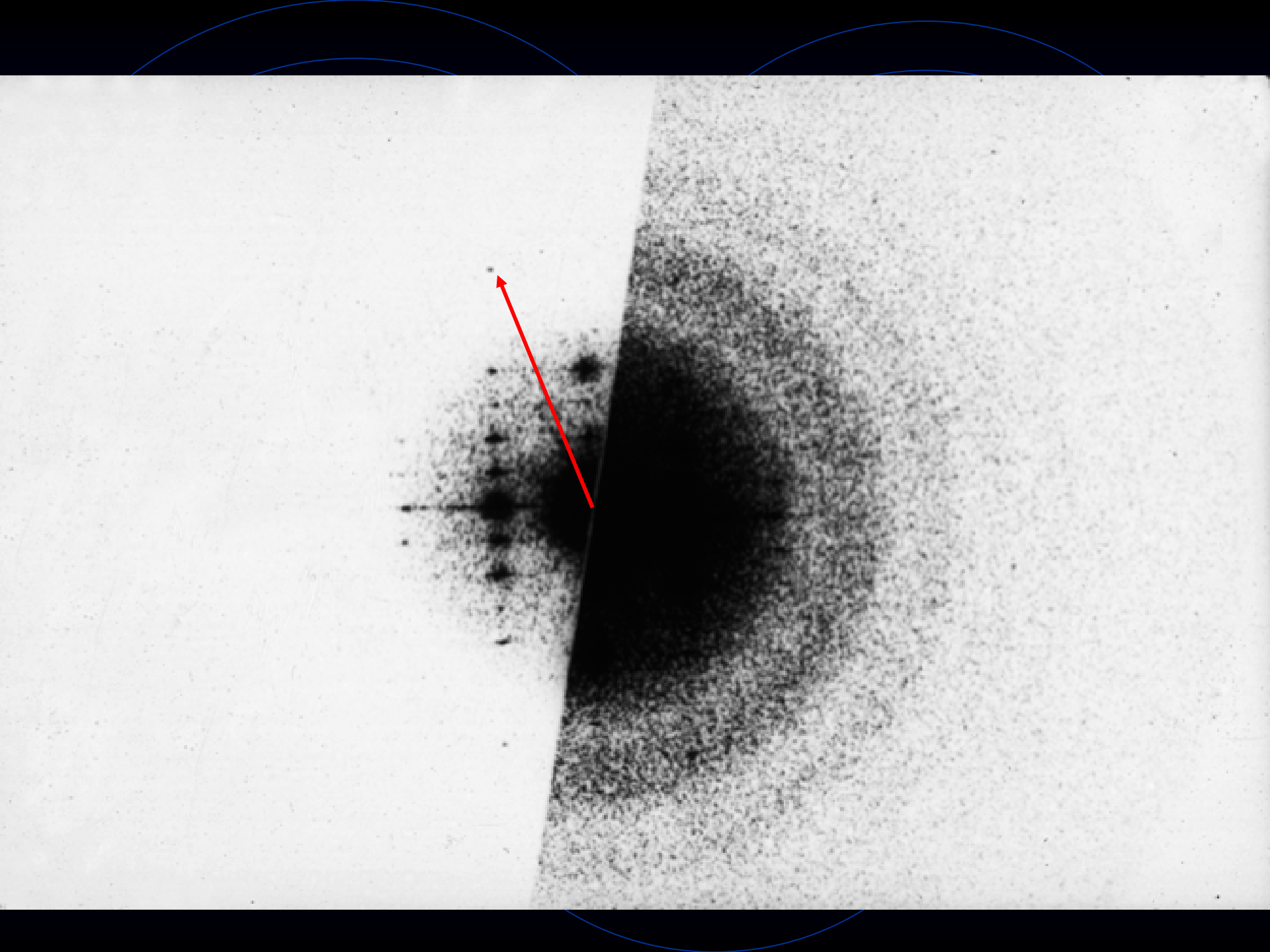
Excited

Unit cell size and shape

Size of coherent domains

Signal/noise ratio

**Resolution**



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

**Amplitude and phases of spots**

What you get

Excited

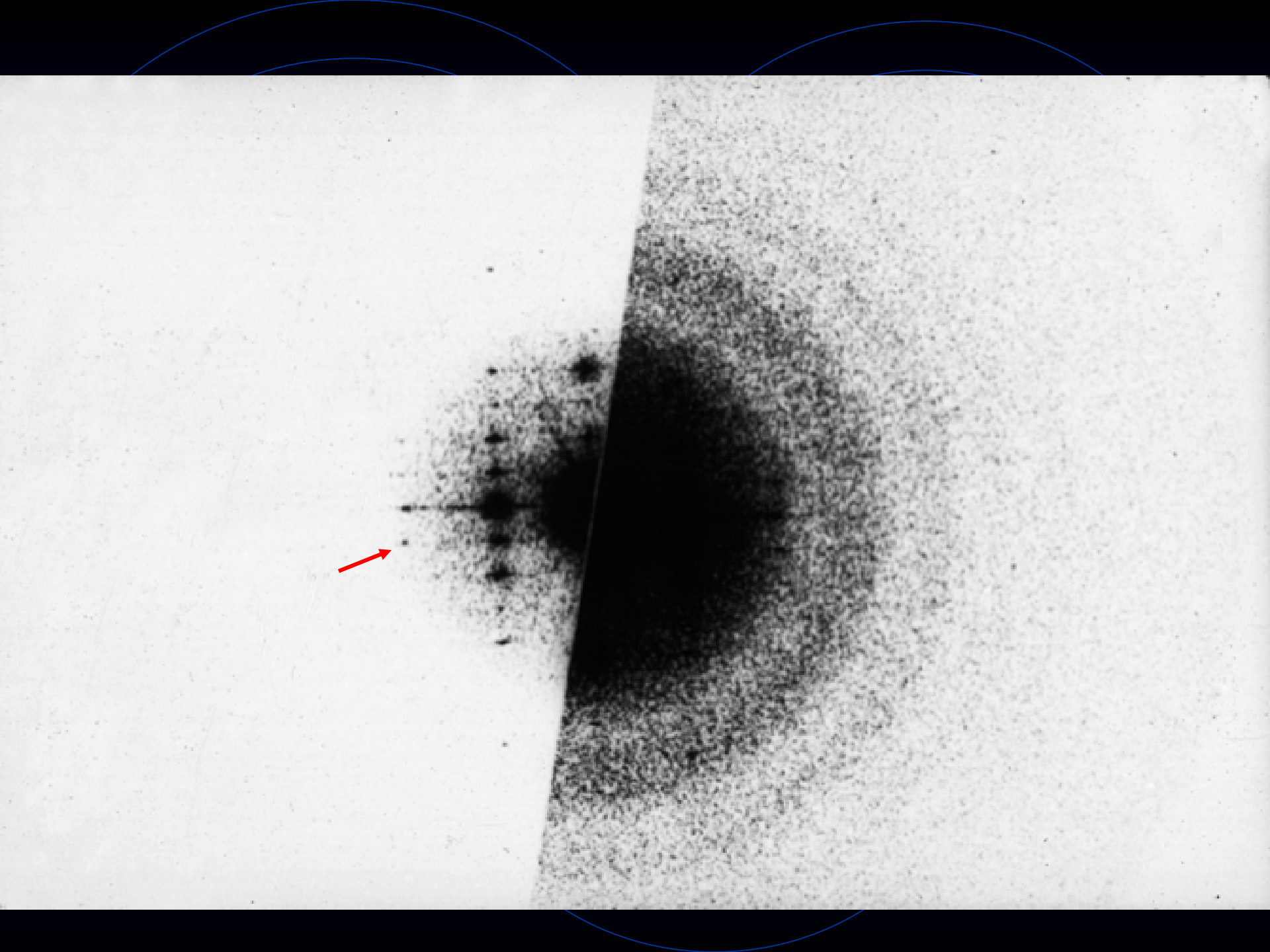
Unit cell size and shape

Size of coherent domains

Signal/noise ratio

Resolution

**Structure of molecules**



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

Amplitude and phases of spots

Positions of Thon rings

What you get

Excited

Unit cell size and shape

Size of coherent domains

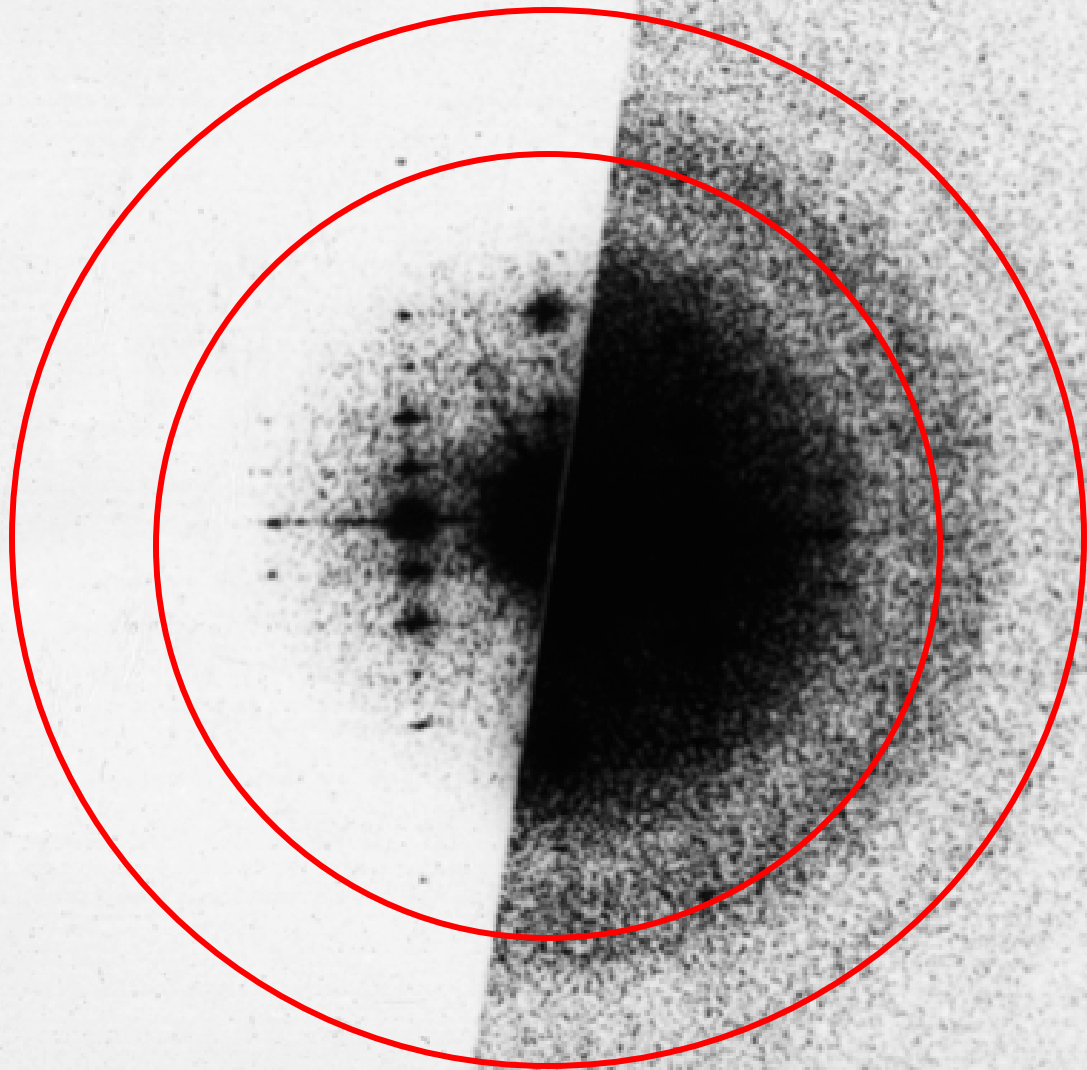
Signal/noise ratio

Resolution

Structure of molecules

Amount of defocus





What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

Amplitude and phases of spots

Positions of Thon rings

Ellipticity of Thon rings

What you get

Excited

Unit cell size and shape

Size of coherent domains

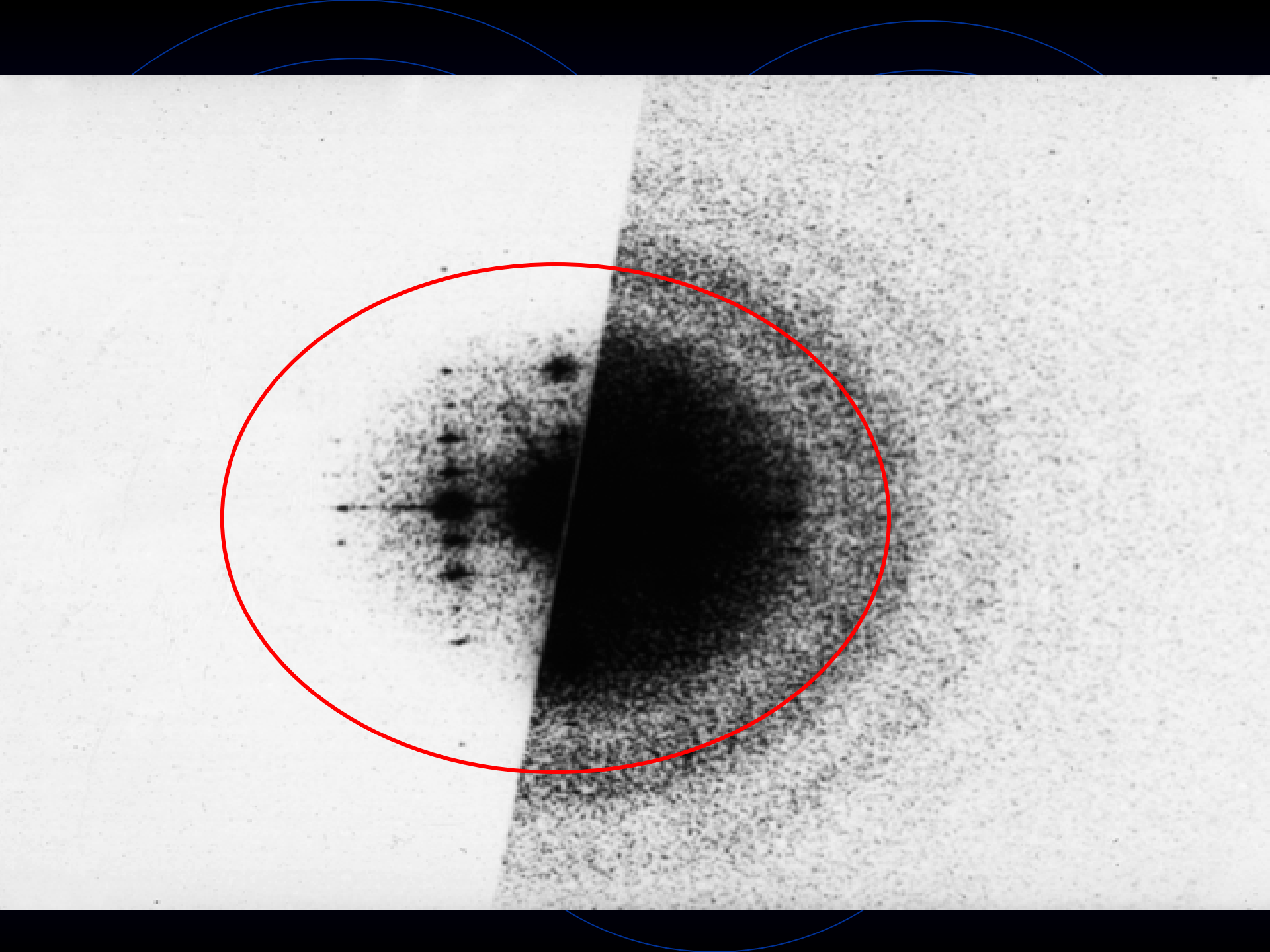
Signal/noise ratio

Resolution

Structure of molecules

Amount of defocus

Amount of astigmatism



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

Amplitude and phases of spots

Positions of Thon rings

Ellipticity of Thon rings

**Asymmetric intensity of Thon rings**

What you get

Excited

Unit cell size and shape

Size of coherent domains

Signal/noise ratio

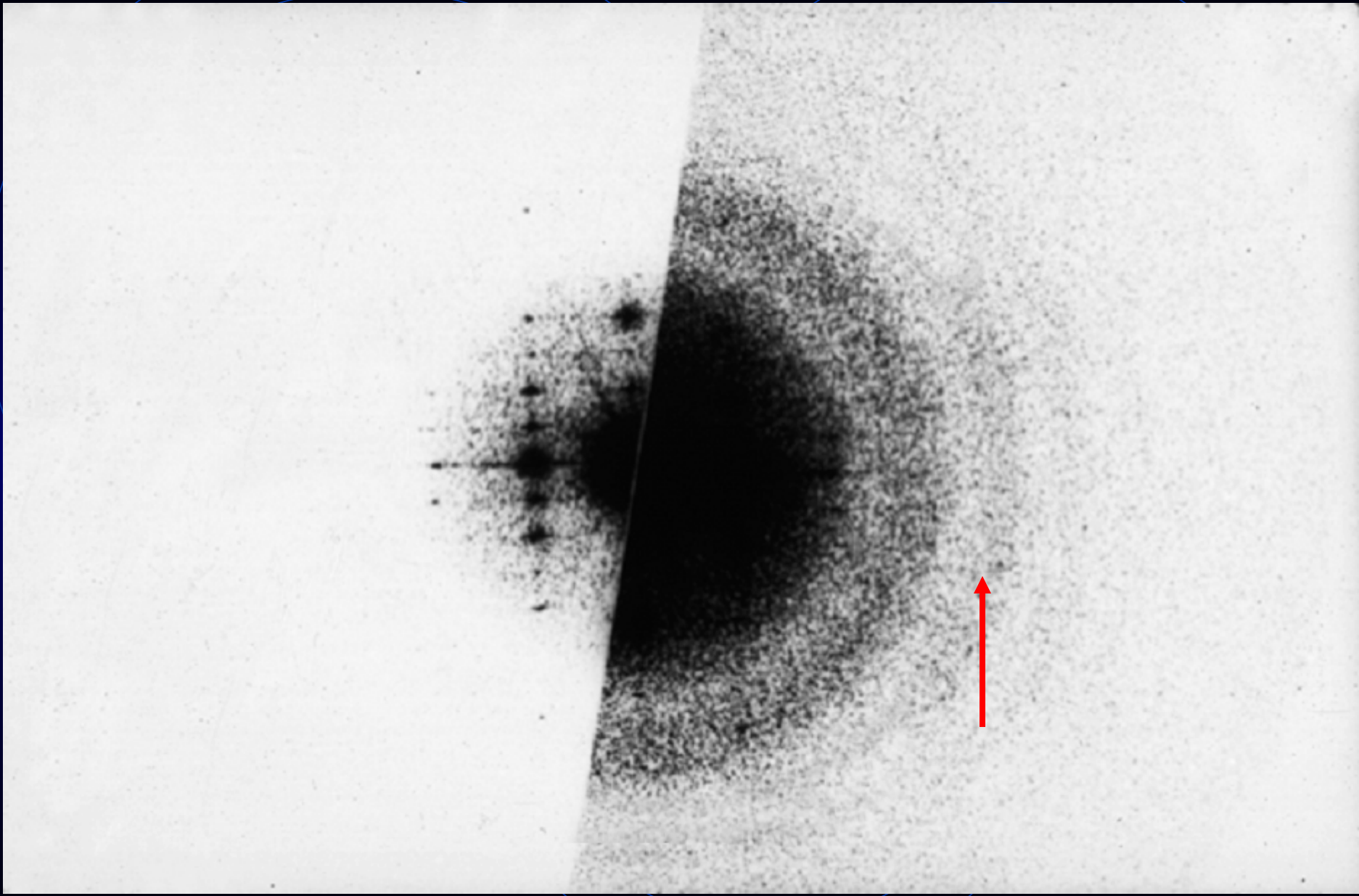
Resolution

Structure of molecules

Amount of defocus

Amount of astigmatism

**Amount of instability**



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

Amplitude and phases of spots

Positions of Thon rings

Ellipticity of Thon rings

Asymmetric intensity of Thon rings

**Direction of asymmetry**

What you get

Excited

Unit cell size and shape

Size of coherent domains

Signal/noise ratio

Resolution

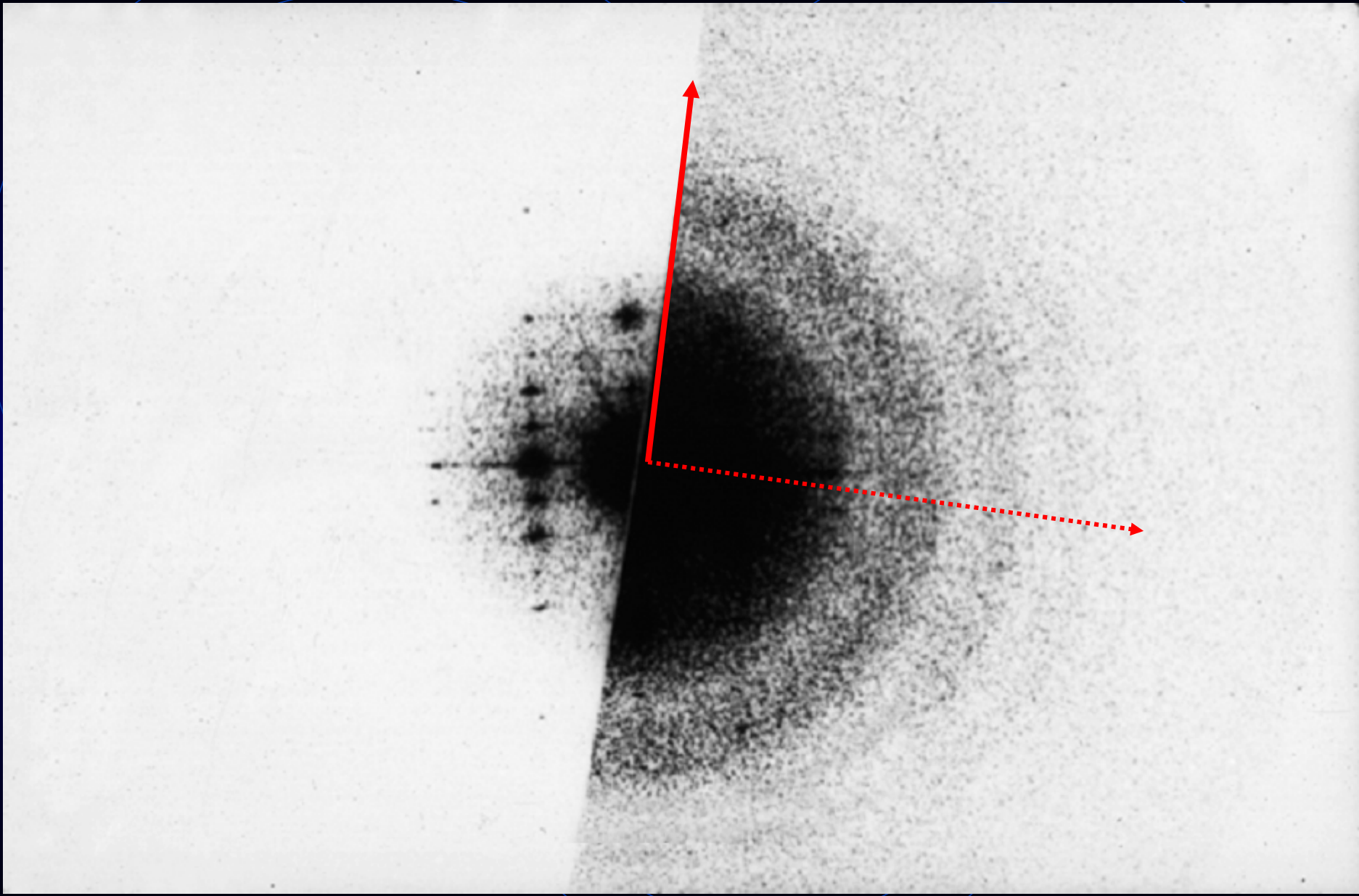
Structure of molecules

Amount of defocus

Amount of astigmatism

Amount of instability

**Direction of instability**



What you see.

Spots

Spot positions

Spot size

Intensity relative to background

Distance to farthest spot

Amplitude and phases of spots

Positions of Thon rings

Ellipticity of Thon rings

Asymmetric intensity of Thon rings

Direction of asymmetry

What you get

Excited

Unit cell size and shape

Size of coherent domains

Signal/noise ratio

Resolution

Structure of molecules

Amount of defocus

Amount of astigmatism

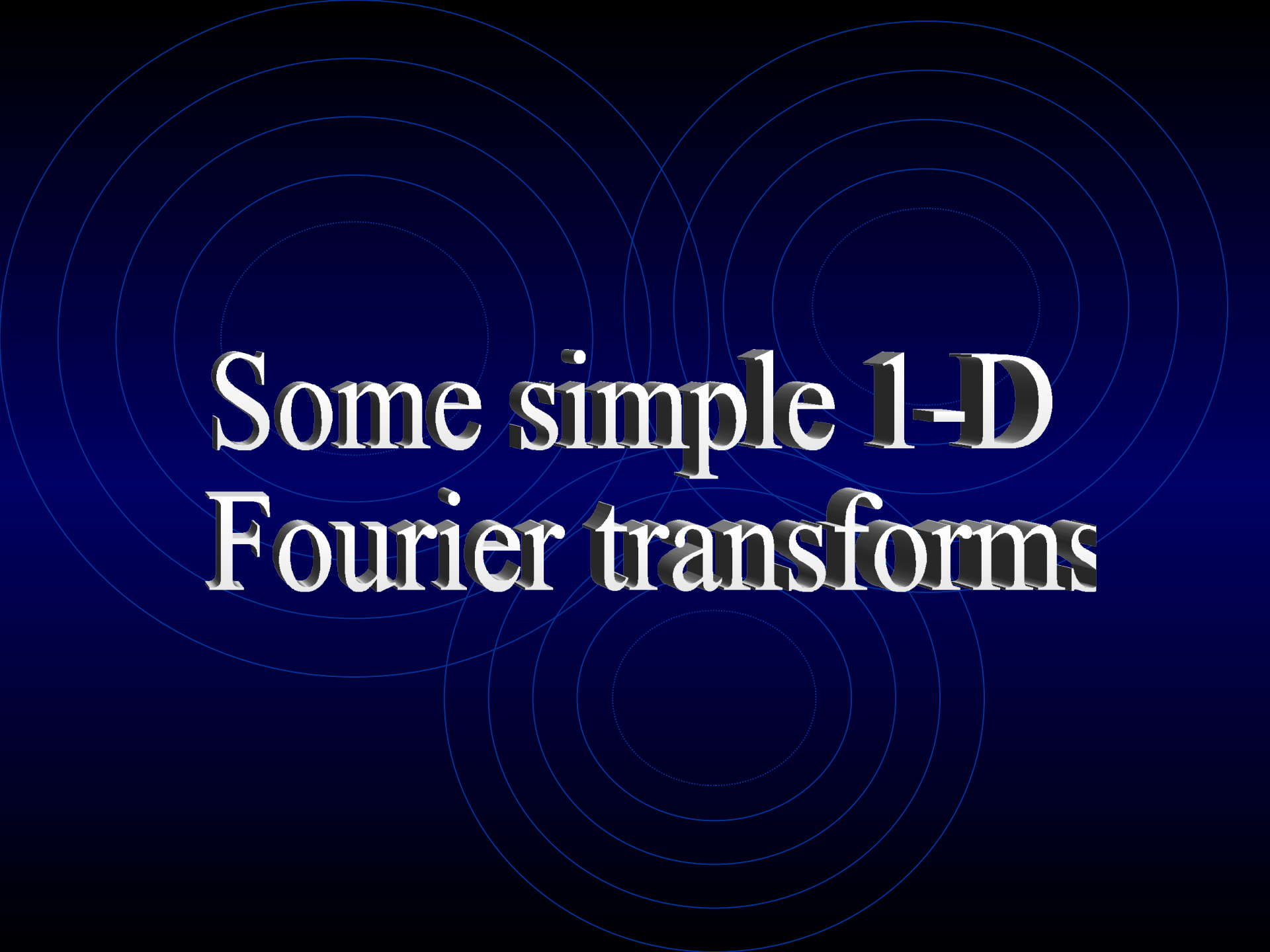
Amount of instability

Direction of instability



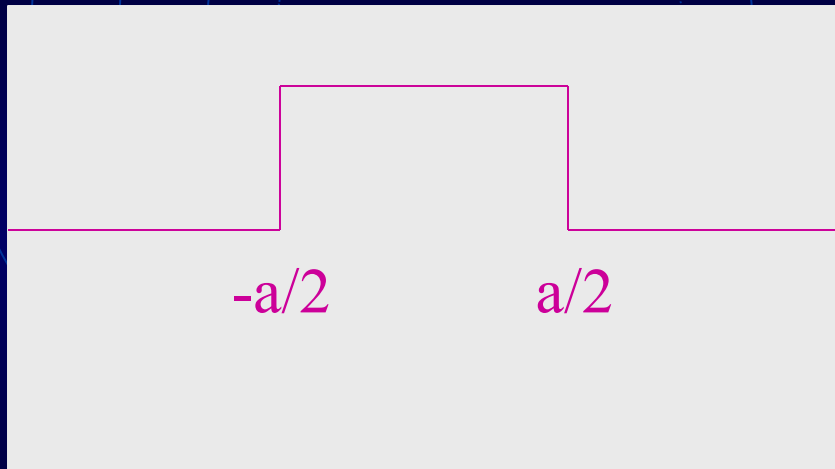


# III. How to think about Fourier transforms.

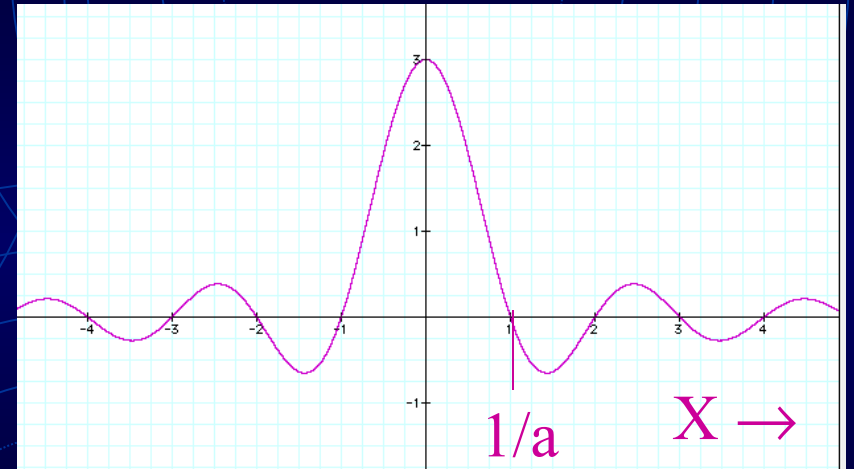


# Some simple 1-D Fourier transforms

## The Fourier transform of a box.

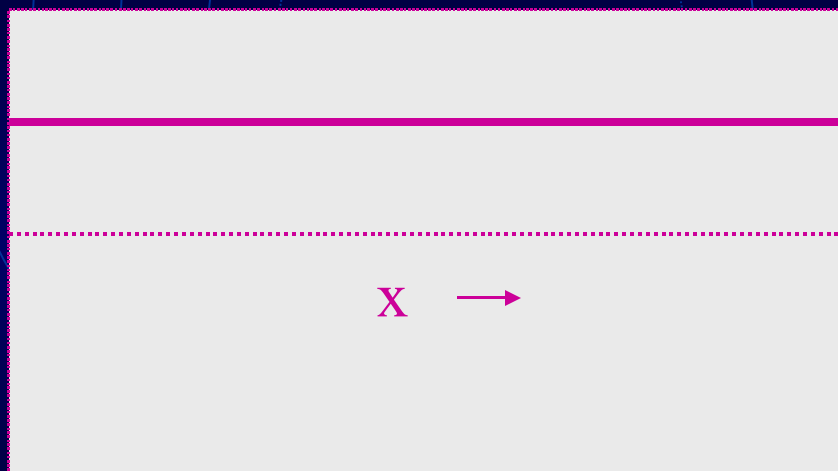


$$f(x)=1 \text{ if } -a/2 < x < a/2$$
$$f(x)=0 \text{ otherwise}$$

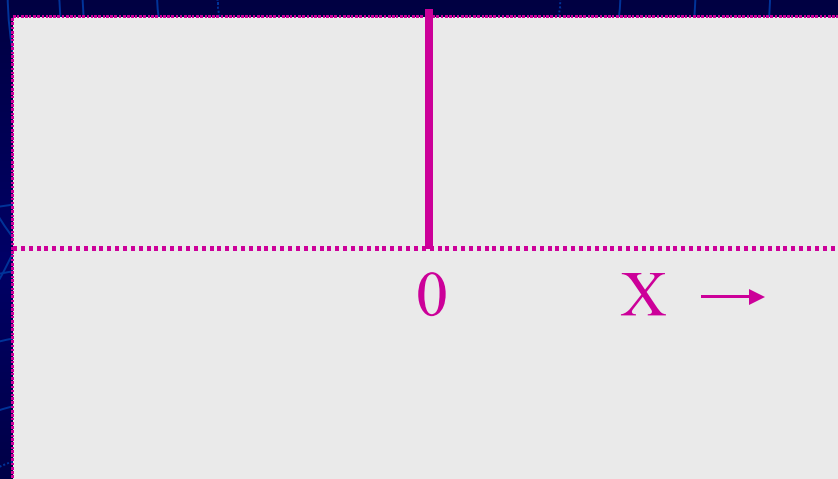


$$F(X) = \left\{ \frac{\sin(\pi a X)}{\pi X} \right\}$$

# Fourier transform of a constant.

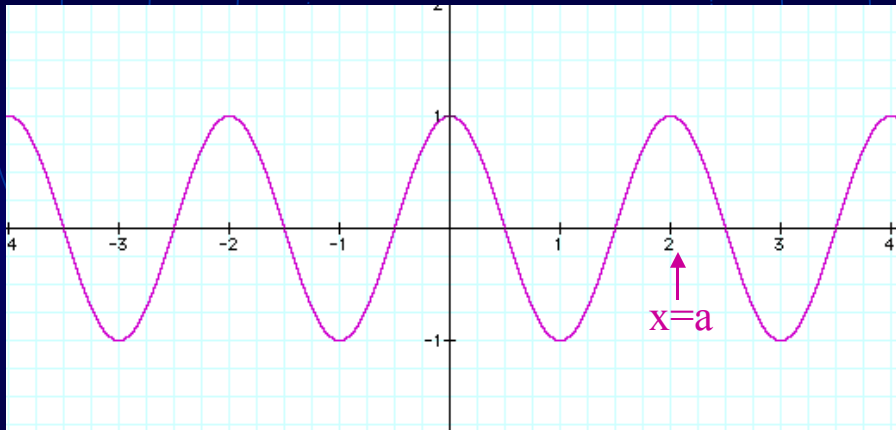


$$f(x) = 1$$

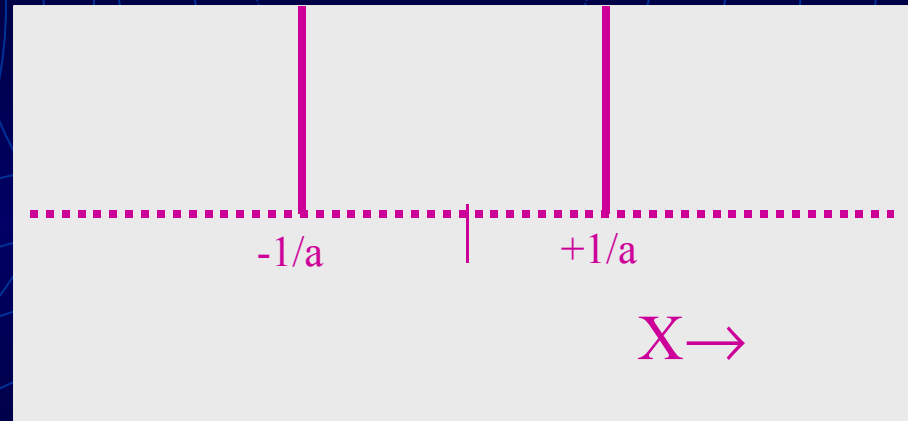


$$F(X) = \delta(X)$$

## Fourier transform of a cosine wave.

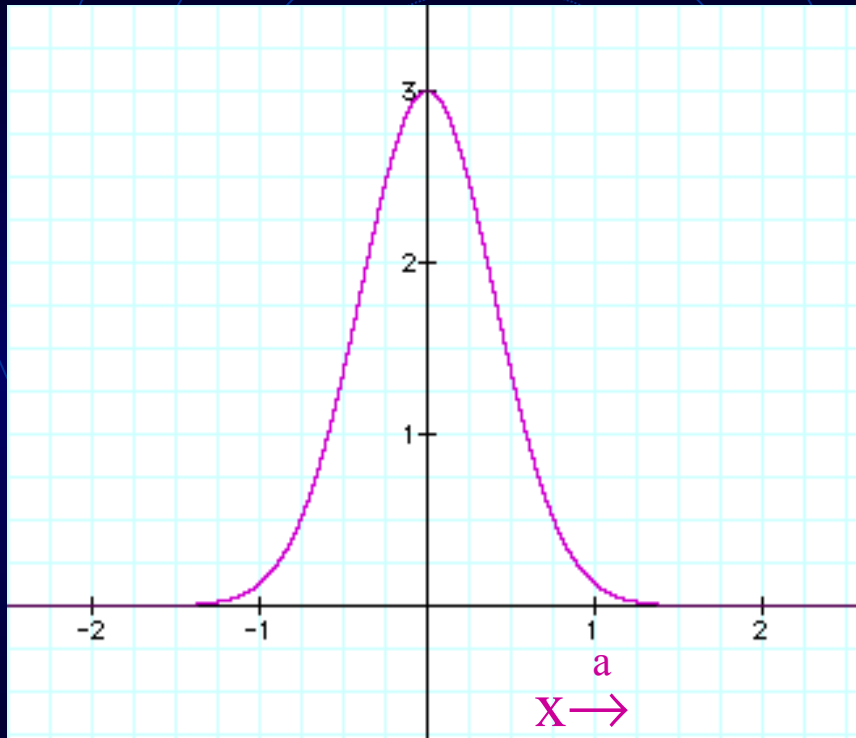


$$f(x) = \cos(2\pi x/a)$$

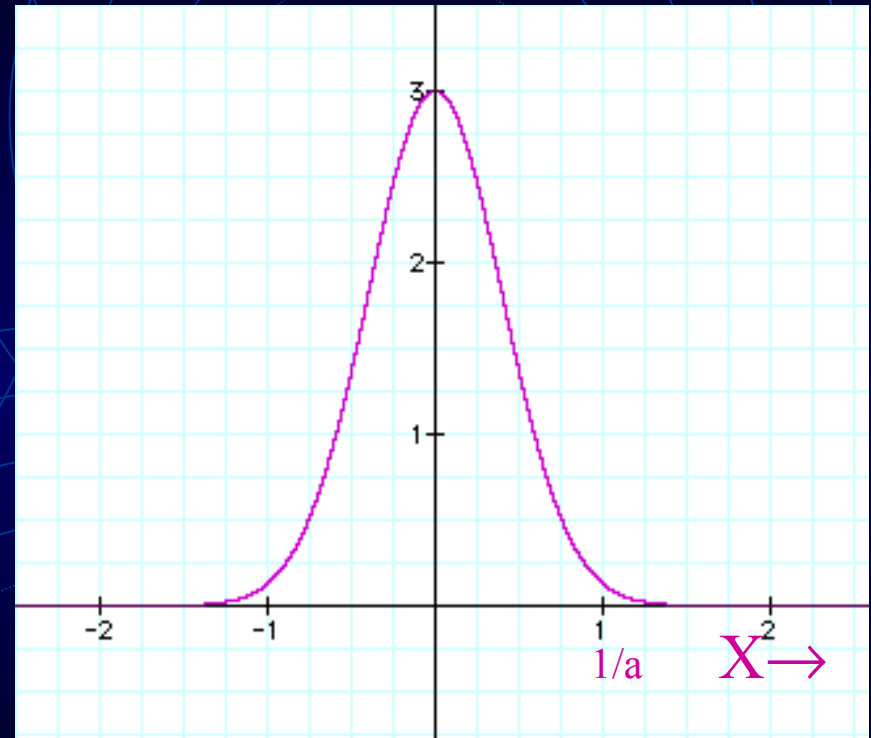


$$F(X) = 0.5[\delta(X+1/a) + \delta(X-1/a)]$$

# Fourier transform of a Gaussian.

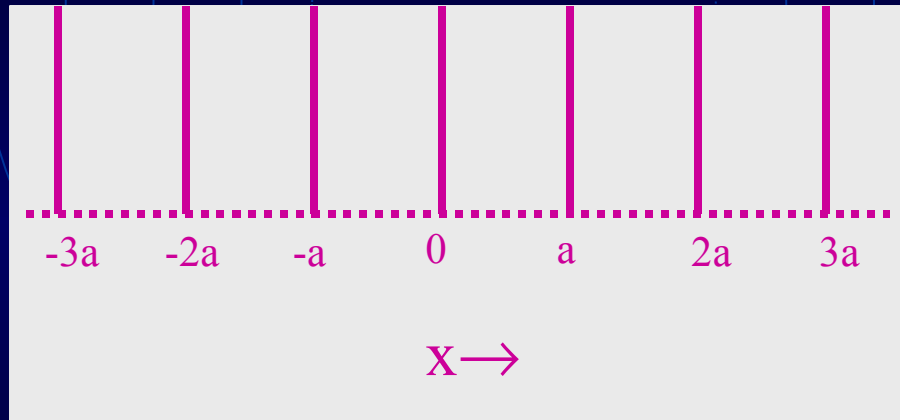


$$f(x) = \exp(-\pi x^2/a^2)$$

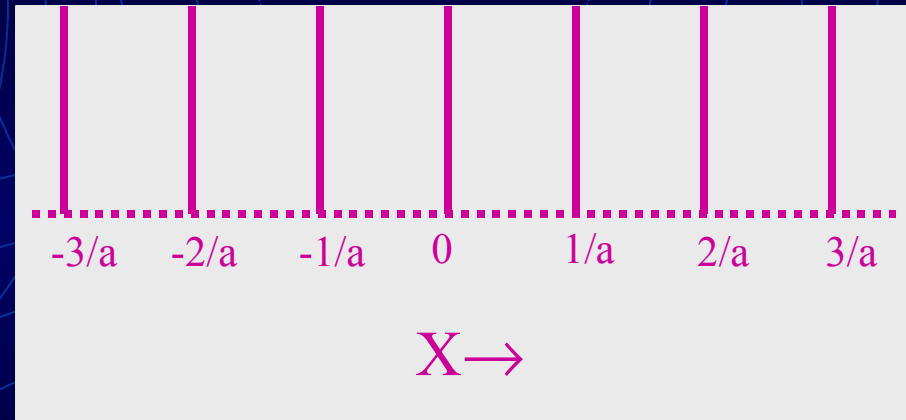


$$F(X) = a \cdot \exp(-\pi X^2 a^2)$$

# The Fourier transform of a lattice.

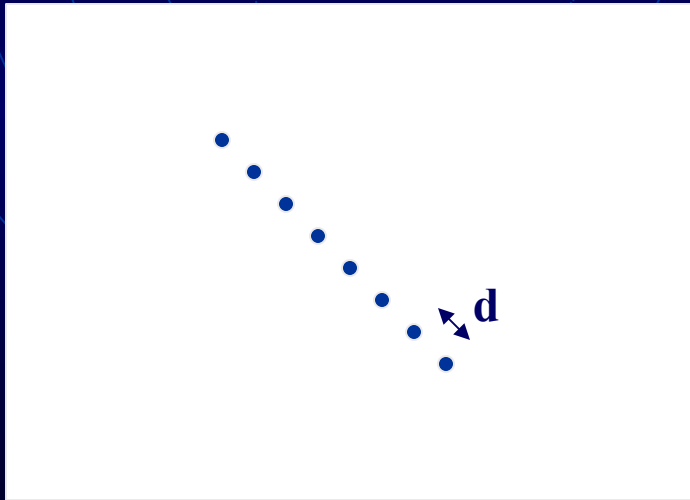


$$f(x) = \dots \delta(x+a) + \delta(x) + \delta(x-a) \dots$$

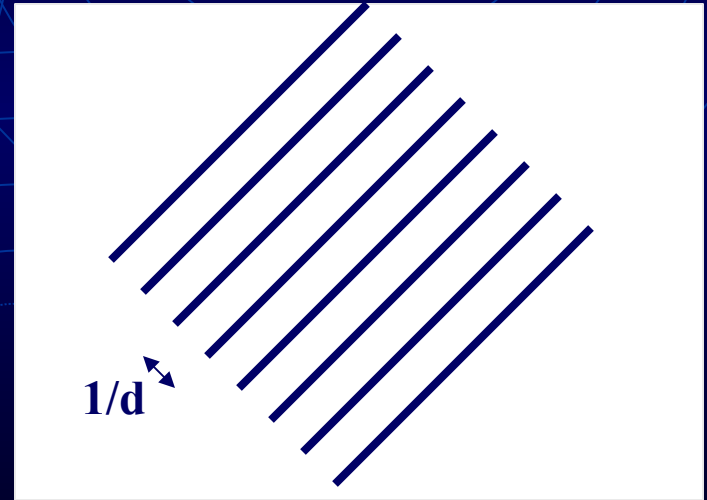


$$F(X) = \dots \delta(X+1/a) + \delta(X) + \delta(X-1/a) \dots$$

In 2D the transform of a row of periodically placed points is a set of lines. This set of lines is perpendicular to the line joining the points.



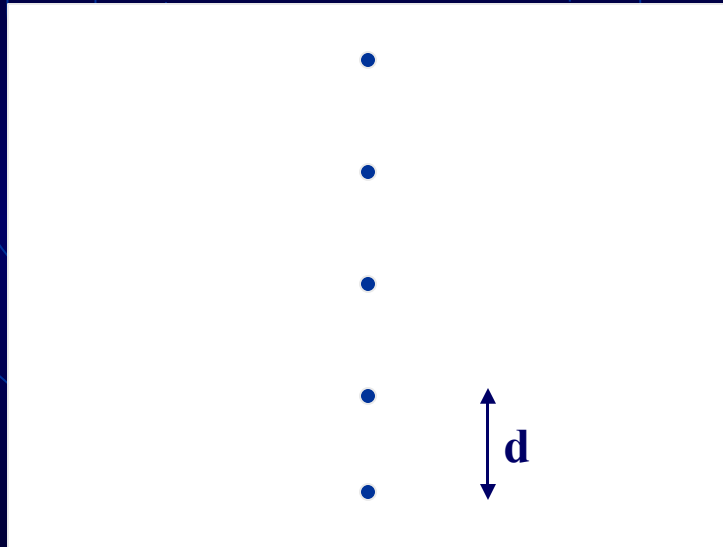
$f(x)$



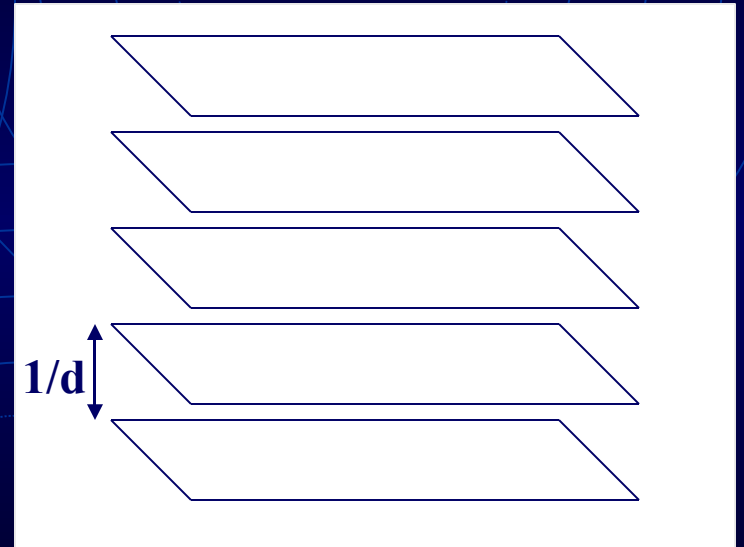
$F(X)$



In 3D, the transform of a row of points is a set of planes. The planes are perpendicular to the line joining the points.

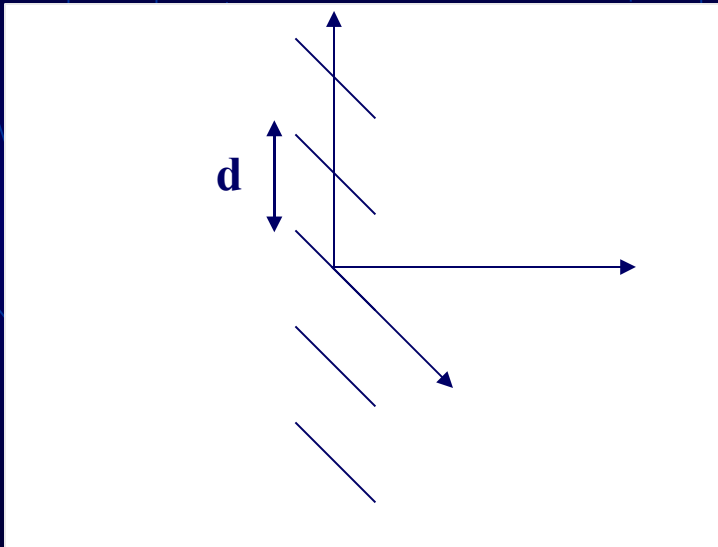


$f(x)$

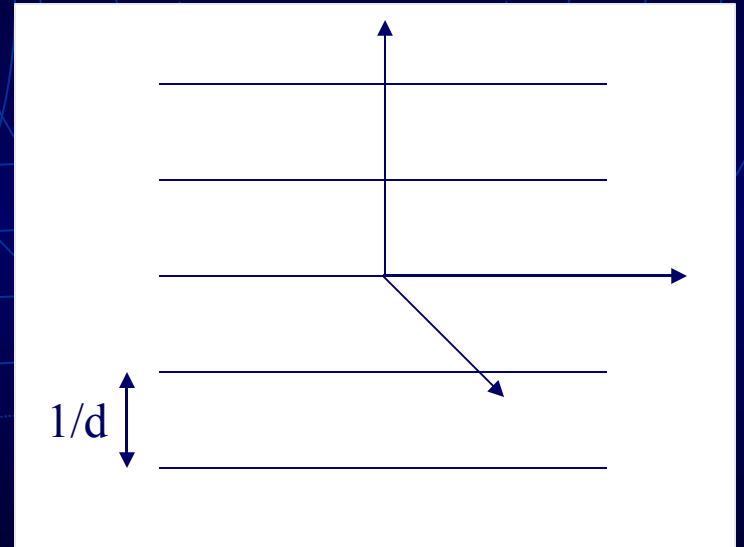


$F(X)$

In 3D, the transform of a plane of evenly spaced lines is a plane of evenly placed lines. These lines in real space are perpendicular to the plane containing the lines in reciprocal space (and vice versa).



$f(\mathbf{x})$



$F(\mathbf{X})$



# Some Rules for Fourier Transforms

## 1. Inverse Fourier transform:

If  $F(X)=FT[f(x)]$ , then  $f(x)=IFT[F(X)]$

where **FT**=Fourier transform & **IFT**=Inverse Fourier transform.

USE: If you can obtain the Fourier transform,  $F(X)$ , of an object, you can regenerate the object itself.

This is the basis of x-ray crystallography and some 3D reconstruction algorithms.

## 2. Multiplication by a constant:

$$\text{FT}[ a \cdot f(x) ] = a \cdot F(X)$$

$$\text{Special case: } \text{FT}[ -f(x) ] = -F(X) = F(X) \cdot e^{i\pi}$$

USE: If you multiply the density by a constant, you multiply its Fourier transform by the same constant.

If you reverse the contrast of an object, you get the same transform except the phases are changed by  $180^\circ$  (Babinet's principle).

Thus the phases obtained from images of negatively stained objects will differ by  $180^\circ$  from those of an ice-embedded object.

3. The addition of two density distributions (objects):

$$\text{FT}[ f(x) + g(x) ] = F(X) + G(X)$$

USE: The Fourier transform of a heavy atom derivative is equal to the Fourier transform of the protein plus the Fourier transform of the constellation of heavy atoms.

This allows one to use heavy atoms to determine the Fourier transform of the protein if the transform of the heavy atom constellation can be deduced.

#### 4. The Fourier transform of a stretched object:

$$\text{FT}[ f(ax) ] = F(x/a)$$

USE: If you stretch/magnify an object by a factor of  $a$ , you squeeze/demagnify its transform by factor of  $a$ .

## 5. Rotation of an object:

$$\text{FT}[ f\{ x \cdot \cos(a) + y \cdot \sin(a), -x \sin(a) + y \cdot \cos(a) \}] = \\ F \{ X \cdot \cos(a) + Y \cdot \sin(a), -X \sin(a) + Y \cdot \cos(a) \}$$

USE: If you rotate an object by an angle  $a$ , you rotate its transform by the same angle.



## 6. Fourier transform of a shifted object:

$$\text{FT}[ f(x-a) ] = F(X) \cdot e^{i\pi a X}$$

USE: If you shift an object by  $+a$ , you leave the amplitudes of its transform unchanged but its phases are increased by  $\pi a X$  radians =  $180^\circ a X$  degrees.

The electron diffraction pattern is not sensitive to movement of the specimen since the intensities do not depend on phases. Vibration of the specimen does not affect the electron diffraction patterns as it does the images.

## 7. The section/projection theorem:

$$\text{FT}[\int f(x,y,z)dx] = F(0,Y,Z)$$

USE: The Fourier transform of a projection of a 3D object is equal to a central section of the 3D Fourier transform of the object.

An electron micrograph is a projection of a 3D object.

Its transform provides one slice of the 3D transform of the 3D object.

By combining the transforms of different views, one builds up the 3D transform section by section.

One then uses the IFT to convert the 3D transform into a 3D image.

8. The Fourier transform of the product of two distributions:

$$\text{FT}[ f(x) \cdot g(x) ] = F(X) * G(X)$$

where \* denotes convolution

USE: This is useful in thinking about the effects of boxing or masking off a particle from the background or in sampling a distribution (multiplying by a lattice).

We will look at some of its uses later on.

## 9. The transform of a real distribution:

If the complex part of  $f(\mathbf{x})$  is zero, then

$$F(-X) = F^*(X)$$

where  $*$  indicates the complex conjugate.

USE: Thus, centrosymmetrically related reflections have the same amplitude but opposite phases (Friedel's law).

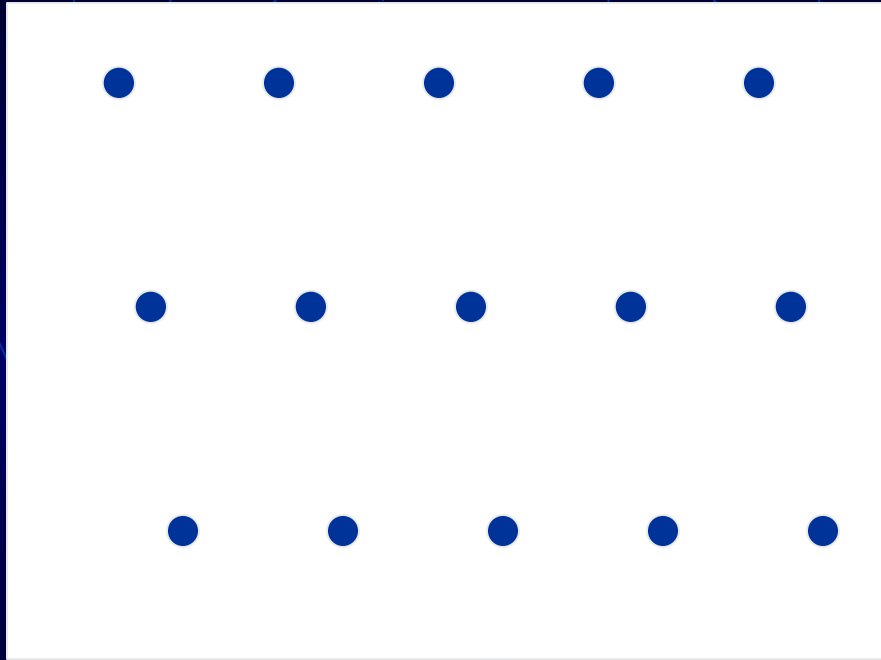
When calculating a transform of an image, one only has to calculate half of it. The other half is related by Friedel's law.

10. Whatever applies to the FT also applies to the IFT.

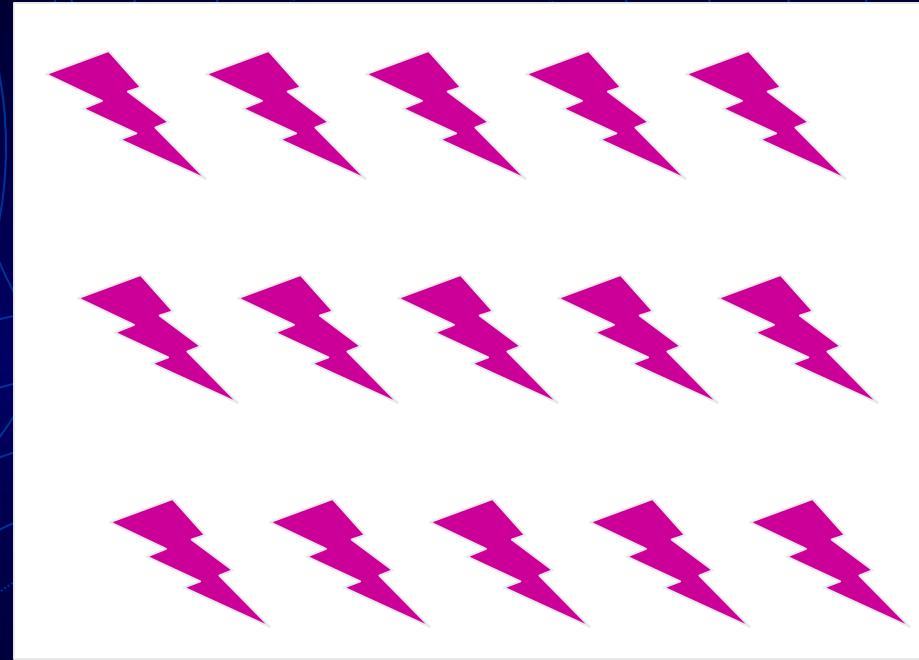
USE: If the Fourier transform of a cosine wave is a pair of delta functions, then the inverse Fourier transform of a cosine wave is also a pair of delta functions.

Convolution of a molecule with a lattice generates a crystal.

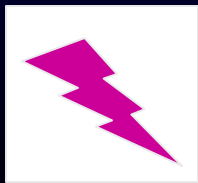
$$f(x) * l(x)$$



lattice =  $l(x)$



Set a molecule down at every lattice point.



Molecule =  $f(x)$

What is the Fourier transform of a crystal?

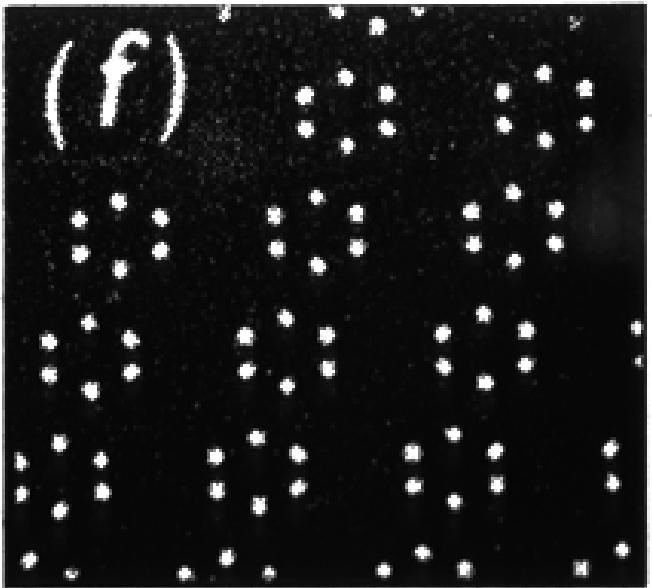
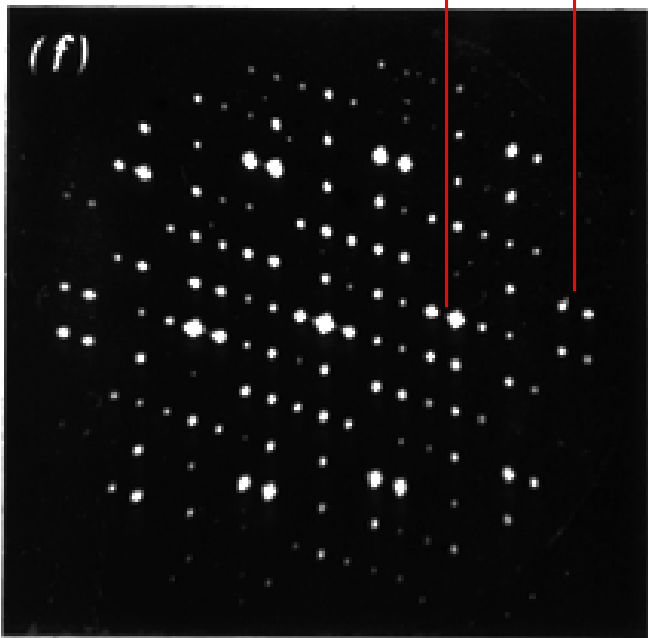
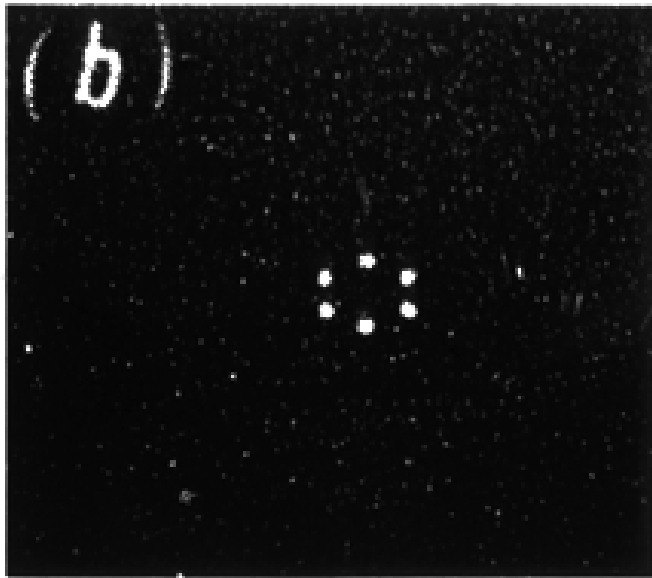
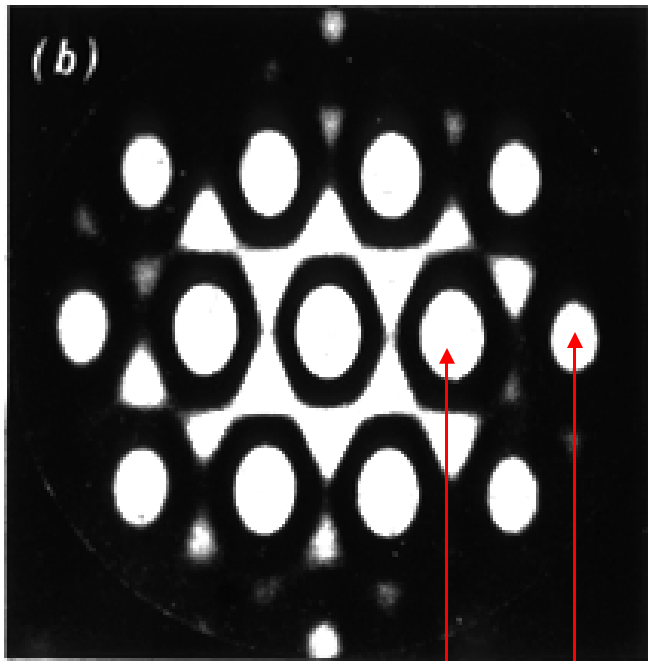
A crystal is the **convolution** of a molecule,  $f$ , with a lattice,  $l$ .

To get the transform, **multiply** the transform,  $F$ , of the molecule times the transform,  $L$ , of the lattice.

$$\text{FT}[ f(x)*l(x) ] = F(X)\cdot L(X)$$

$L(X)$  is a lattice, the reciprocal lattice.

Thus what one sees in the transform of a crystal is the transform of the molecule, but you can only see it at reciprocal lattice points.





What is the Fourier transform of a sampled (digitized) image?

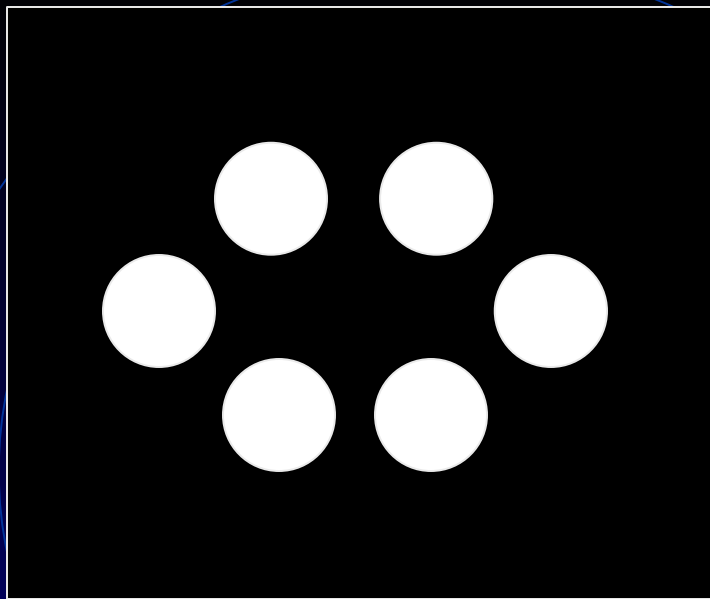
A sampled image is the **product** of a molecule,  $f$ , with a lattice,  $l$ .

To get the transform, **convolute** the transform,  $F$ , of the molecule with the transform,  $L$ , of the sampling lattice.

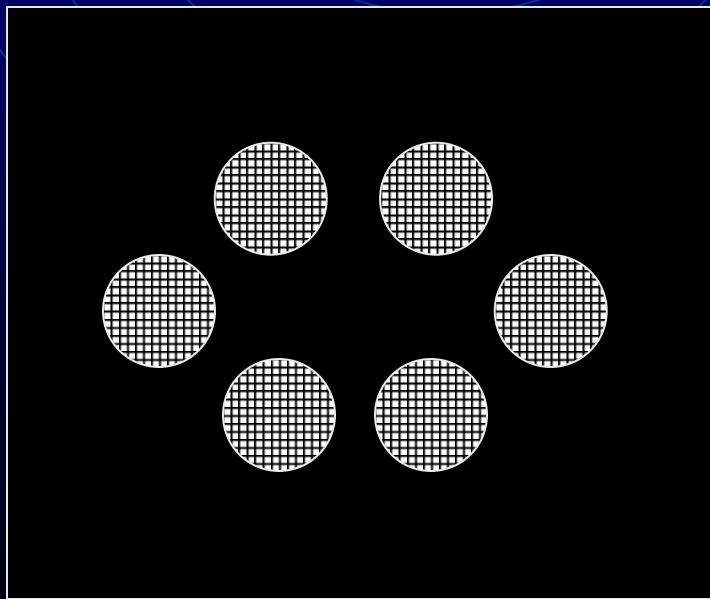
$$\text{FT}[ f(x) \cdot l(x) ] = F(X) * L(X)$$

$L(X)$  is a lattice, the reciprocal lattice.

Thus what one sees is the transform of the molecule repeated at every reciprocal lattice point.



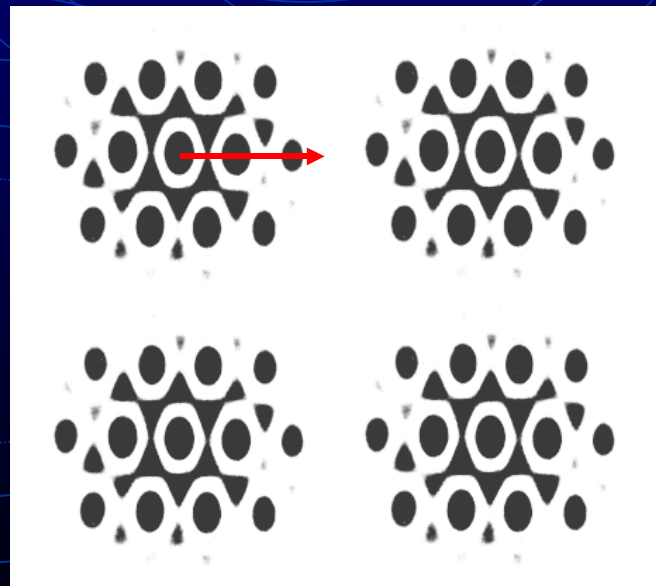
unsampled image



finely sampled image

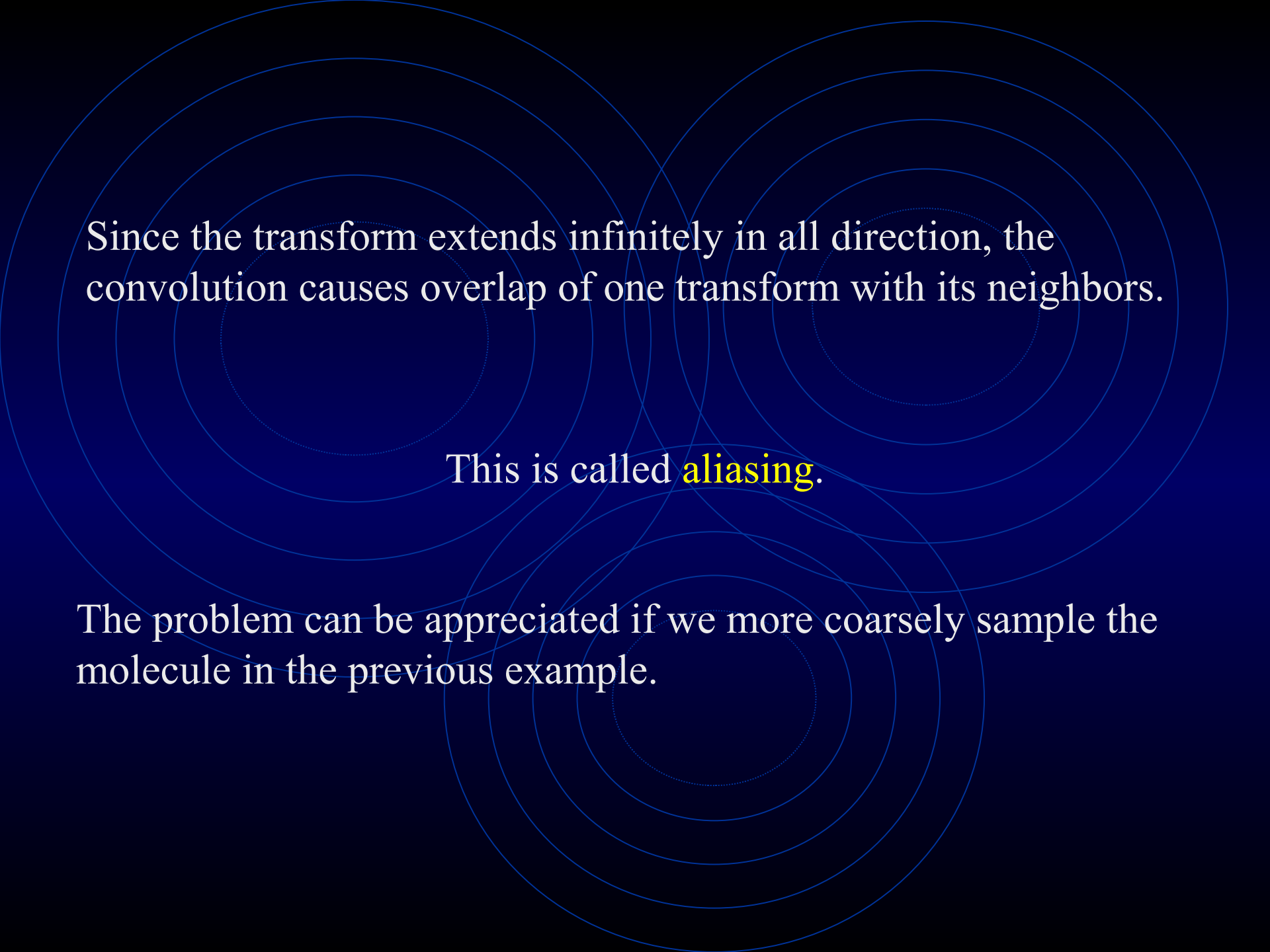


transform



Nyquist  
frequency

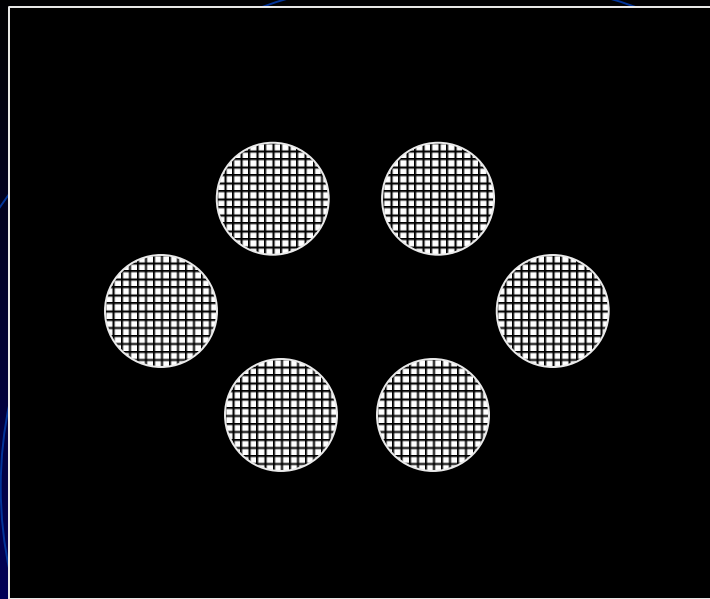
convoluted transform



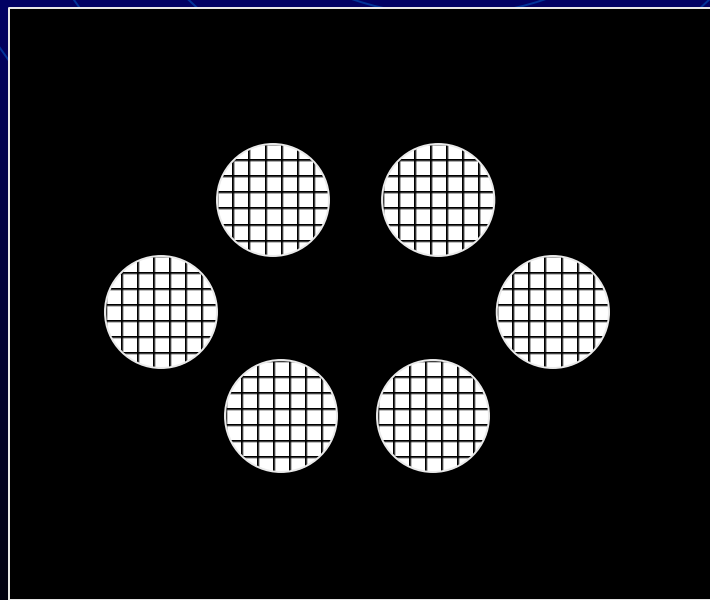
Since the transform extends infinitely in all directions, the convolution causes overlap of one transform with its neighbors.

This is called **aliasing**.

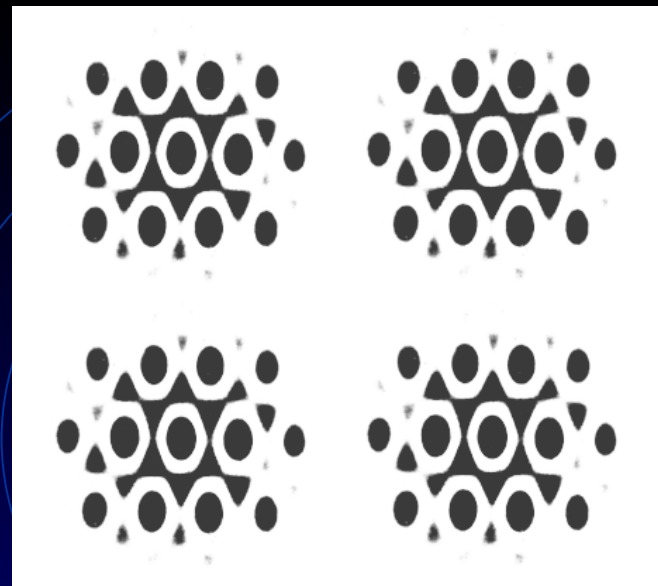
The problem can be appreciated if we more coarsely sample the molecule in the previous example.



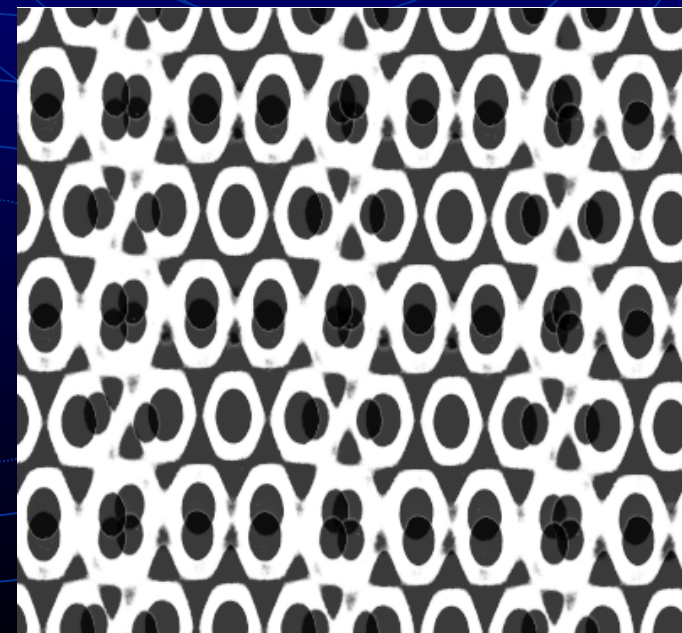
finely sampled image



coarsely sampled image



convoluted transform



badly aliased example

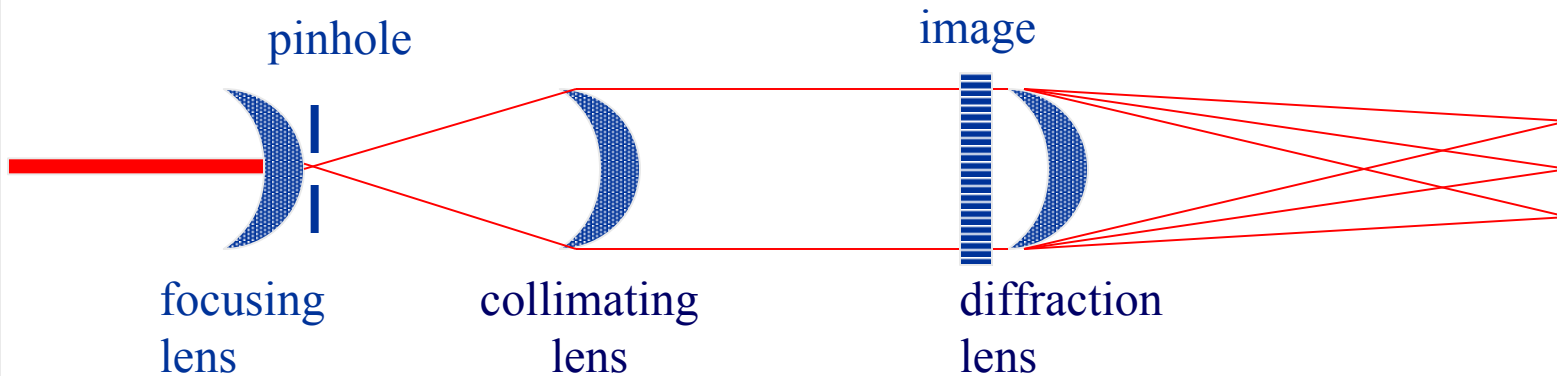
## Tricks to control aliasing:

1. In digitizing, use an aperture that is equal to the step size.
2. Remove any large steps in image density by
  - a. removing any gradient of density across the image,
  - b. floating the image,
  - c. and apodizing the edge of the image



# IV. How to get a Fourier transform.

Fourier transform



## Optical diffractometer

$$d d^* = f \lambda$$

$d$  = spacing on the image

$d^*$  = spacing in the Fourier transform

$f$  = focal length of the diffraction lens

$\lambda$  = wavelength of light

One gets the intensities (**amplitudes**) only. To get the **phases**, one needs to compute the FT.

Fourier transforms have both real and imaginary parts.

The real part:

$$F_R(X=1/a) = \sum f(x) \cdot \cos(360x/a)$$

The imaginary part:

$$F_I(X=1/a) = \sum f(x) \cdot \sin(360x/a)$$



One can turn the real and imaginary parts into amplitudes and phases.

**Amplitude:**

$$|\mathbf{F}(X=1/a)| = (\mathbf{F}_R * \mathbf{F}_R + \mathbf{F}_I * \mathbf{F}_I)^{1/2}$$

**Phase:**

$$\alpha(X=1/a) = \tan^{-1}(\mathbf{F}_I/\mathbf{F}_R)$$

The discrete Fourier transform: what the computer does.

An image  $f(x)$  is sampled at a lattice of points spaced every  $\Delta x$  giving us  $f(j \Delta x)$ . The image contains  $N$  pixels.

The transform is calculated at steps of  $1/(N\Delta x)$ :

$$F_R[X=k/(N\Delta x)] = \sum f(j\Delta x) \cos(360jk/N)$$

$$F_I[X=k/(N\Delta x)] = \sum f(j\Delta x) \sin(360jk/N)$$

where  $0 \leq j \leq N-1$  and  $0 \leq k \leq N-1$

The inverse of the discrete Fourier transform:

$$f(x=j\Delta x) = (1/N) \sum \{F_R[k/(N\Delta x)]\cos(360jk/N) + F_I[k/(N\Delta x)]\sin(360jk/N)\}$$

where  $0 \leq j \leq N-1$  and  $0 \leq k \leq N-1$

Since  $f(x)$  can be exactly regenerated, no information is lost when determining  $F(X)$ .

Sample calculation:

$j$	0	1	2	3
$f(j\Delta x)$	1	2	1	0

$k$	0	1	2	3 = -1
$F_R(k/N\Delta x)$	4	0	0	0
$F_I(k/N\Delta x)$	0	2	0	-2

$k$	0	1	2	3 = -1
amplitude	4	2	0	2
phase	0	90	-	-90

Friedel's law

What happens if we more finely sample the image?

Image  $f(x)$  is sampled at  $\Delta x/2$  instead of  $\Delta x$ ;  
it contains  $2N$  instead of  $N$  pixels.

The transform is sampled at  $1/(2N\Delta x/2) = 1/(N\Delta x)$ ; i.e. unchanged.

However, since there are  $2N$  instead of  $N$  steps, the resolution is twice as good.

What happens if we keep the same sampling step in the image but double the number of points (called padding)?

If the image  $f(x)$  is still sampled at  $\Delta x$ , but now contains  $2N$  instead of  $N$  pixels, the transform is calculated at steps of  $1/(2N\Delta x)$  which is two times finer than before.

However, since there are twice as many steps but each step is half the size, the resolution is unchanged.

This trick of more finely sampling is useful when you want to interpolate data in the Fourier transform.



And now I return you  
to real space!