

# LECTURE 9

## X-RAY CT RECONSTRUCTION

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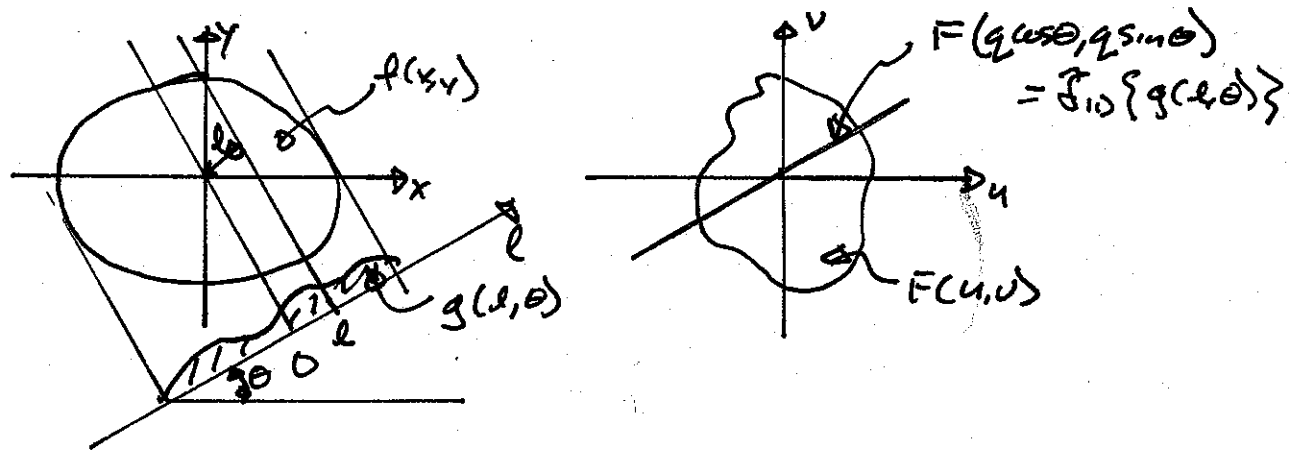
LAST TIME:

1) X-RAY MEASUREMENTS CAN BE CONVERTED INTO LINEAR MEASUREMENTS OF THE ATTENUATION

$$-\log\left(\frac{I_d}{I_0}\right) = \int_0^d \mu(s; \vec{E}) ds$$

THIS IS THE LINE INTEGRAL OF  $\mu(s; \vec{E})$  ALONG RAY S.

2) PROJECTION AT AN ANGLE  $\theta$  CORRESPONDS TO A DIAMETER IN SPATIAL FREQUENCY



IF WE COLLECT MANY PROJECTIONS AT DIFFERENT  $\theta$ 'S, WE SHOULD BE ABLE TO RECOVER  $F(u, v)$  AND  $f(x, y)$ .

# RECONSTRUCTION

(2)

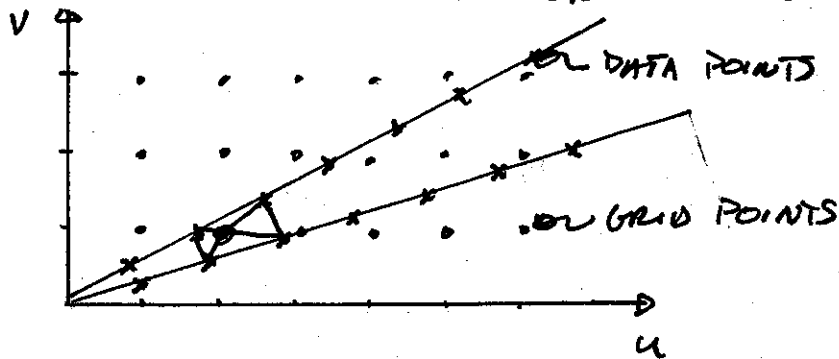
## SIMPLE APPROACH: FREQUENCY DOMAIN INTERPOLATION

- 1) TRANSFORM PROJECTIONS
- 2) INTERPOLATE ONTO 2D SPATIAL FREQUENCY GRID
- 3) INVERSE 2D FFT

HOW DO YOU DO THE INTERPOLATION?

### VERSION 1

INTERPOLATE NEAREST DATA FOR EACH GRID POINT



WORKS WELL.

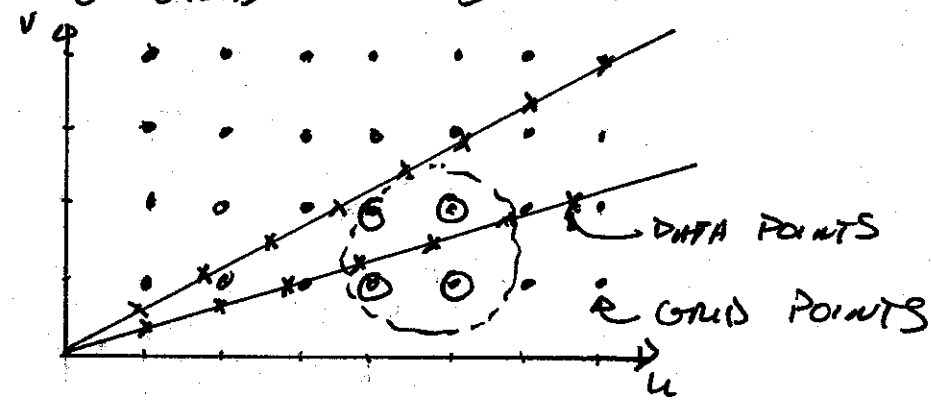
NOT ALL DATA POINTS ARE USED

AT ORIGIN THERE ARE MANY MORE DATA POINTS  
THAN GRID POINTS

IDEALLY, WE WANT TO USE ALL OF THE MEASUREMENTS.

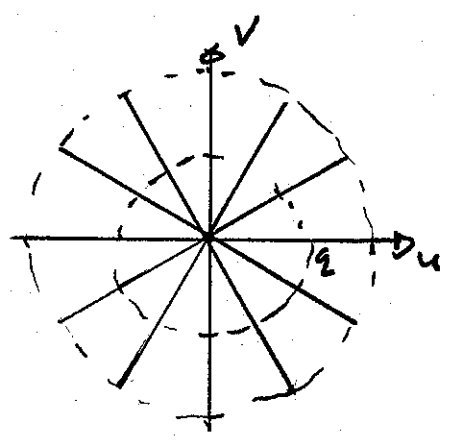
VERSION 2

ADD CONTRIBUTION OF EACH DATA POINT TO ALL  
NEIGHBORING GRID POINTS



ALL DATA CONTRIBUTES.

TOO MUCH DATA AT ORIGIN



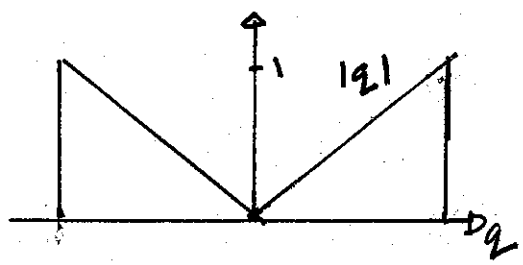
AT RADIUS  $r$  THERE ARE  $2\pi r$   
SAMPLES, AND A SAMPLE DENSITY OF

$$\frac{2\pi}{2\pi r}$$

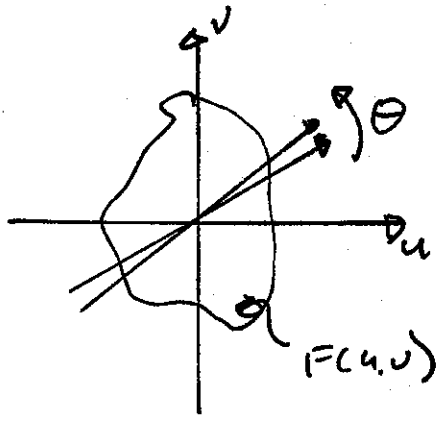
AS  $r$  GETS SMALL, DENSITY GETS LARGE

WE CORRECT FOR THIS BY MULTIPLYING  
BY  $|r|$ .

"RHO" FILTER



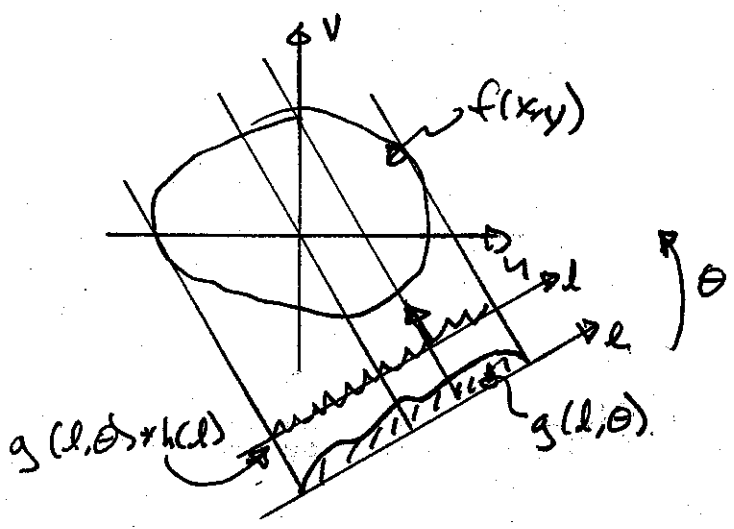
SUMMARY OF 2D FOURIER DOMAIN INTERPOLATION



- 1) TRANSFORM PROJECTIONS
- 2) MULTIPLY BY  $|q|$
- 3) ADD TO 2D GRID
- 4) INVERSE 2D FFT

ALTERNATIVE APPROACH

WHAT DO THESE STEPS CORRESPOND TO IN THE IMAGE DOMAIN?



- 1) NOTHING
- 2) CONVOLVE WITH  $\int_{-1}^1 |q|$
- 3) SPREAD FILTERED PROJECTION ACROSS IMAGE  
BACKPROJECTION
- 4) NOTHING

THIS IS CALLED

FILTERED BACKPROJECTION

CONVOLUTION BACKPROJECTION

WIDELY USED.

ISSUES

FOURIER DOMAIN INTERPOLATION

ACCURACY OF RHO FILTER

ACCURACY OF INTERPOLATION

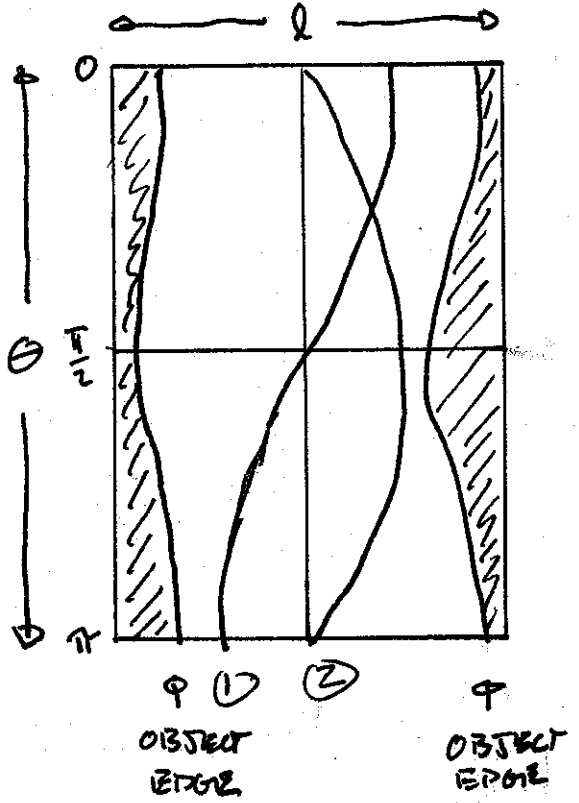
FILTERED BACKPROJECTION

ACCURACY OF CONVOLUTION FILTER

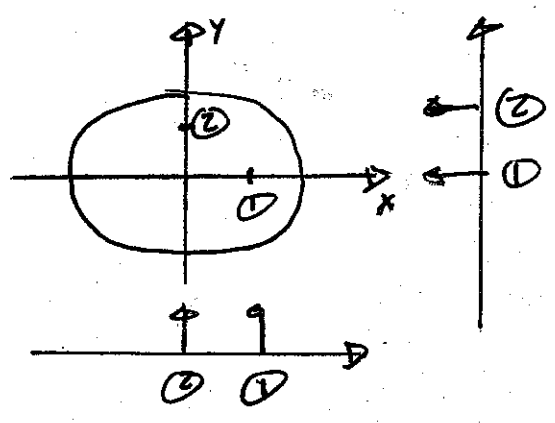
INTERPOLATION OF RAYS ONTO 2D GRID

FILTERED BACKPROJECTION IMPLEMENTATION

INITIAL DATA IS IN  $(l, \theta)$  SPACE: RADON SPACE



EACH POINT IN OBJECT TRACES OUT A SINUSOID IN RADON TRANSFORM



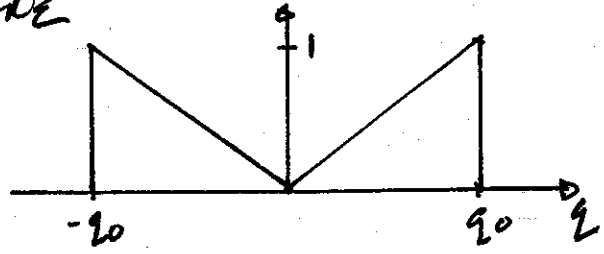
THIS IS CALLED A SINOGRAM

# RHO FILTER

CONVOLVE EACH PROJECTION (ROW OF SINOGRAM) WITH

$$h(\omega) = \mathcal{F}_D^{-1} \{H(\omega)\}$$

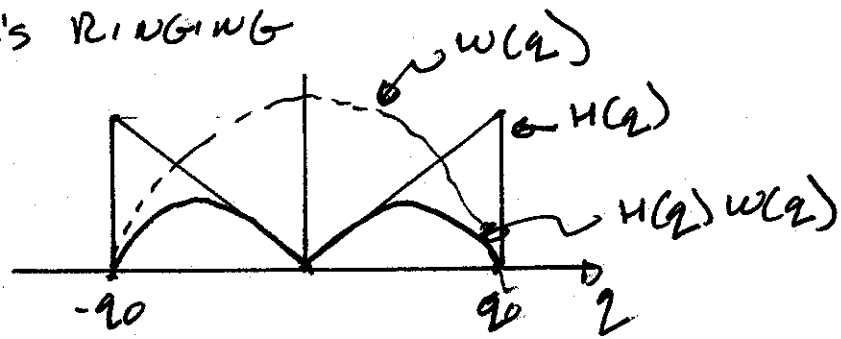
WHERE



$$H(\omega) = \frac{|\omega|}{90} \text{rect}\left(\frac{\omega}{290}\right)$$

ON THE MISTAKE YOU SOLVED FOR THE DISCRETE VERSION OF  $h(\omega)$ , WHICH HAS A SIMPLE FORM.

OFTEN A WINDOW FUNCTION IS INCLUDED TO REDUCE GIBB'S RINGING



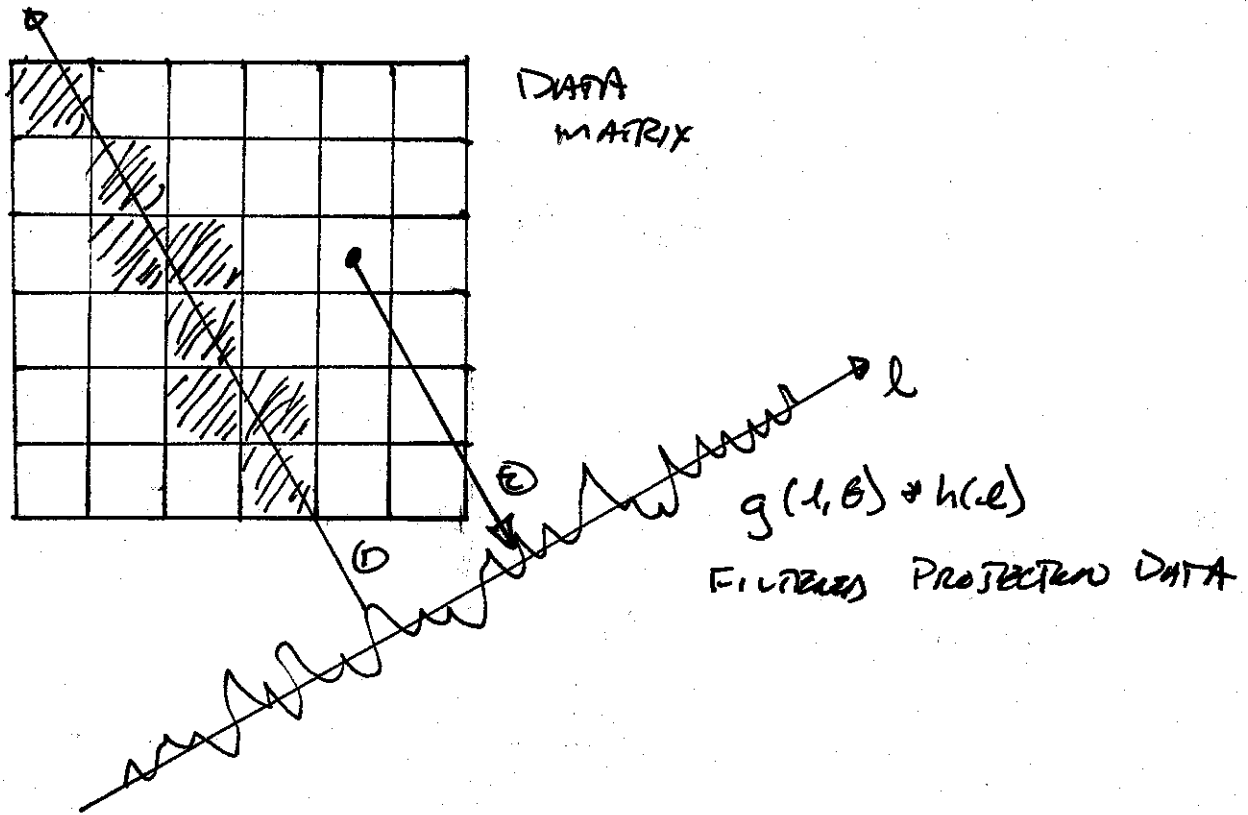
REDUCES RESOLUTION.

RHO FILTER CAN BE IMPLEMENTED AS CONVOLUTION IN PROJECTION DOMAIN OR MULTIPLICATION IN FREQUENCY DOMAIN (HW).

RESULT IS A FILTERED SINOGRAM

# BACKPROJECTION

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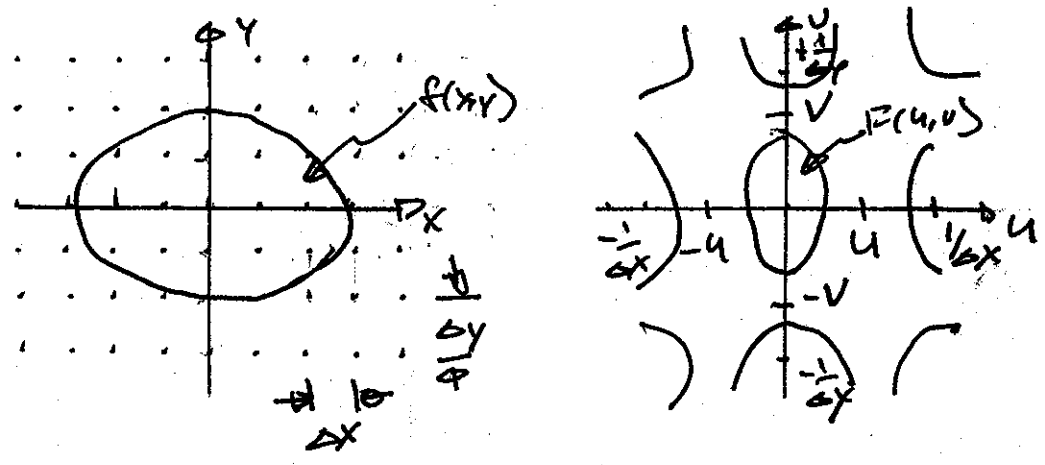
## TWO APPROACHES

- 1) PUSH PROJECTION THROUGH MATRIX, ADDING TO THE PIXELS IT CROSSES, WEIGHTED BY HOW CLOSE IT PASSES
- 2) TAKE THE LOCATION OF EACH PIXEL, AND INTERPOLATE INTO THE FILTERED PROJECTION DATA (HW)

SAME RESULT EITHER WAY.

# SAMPLING REQUIREMENTS

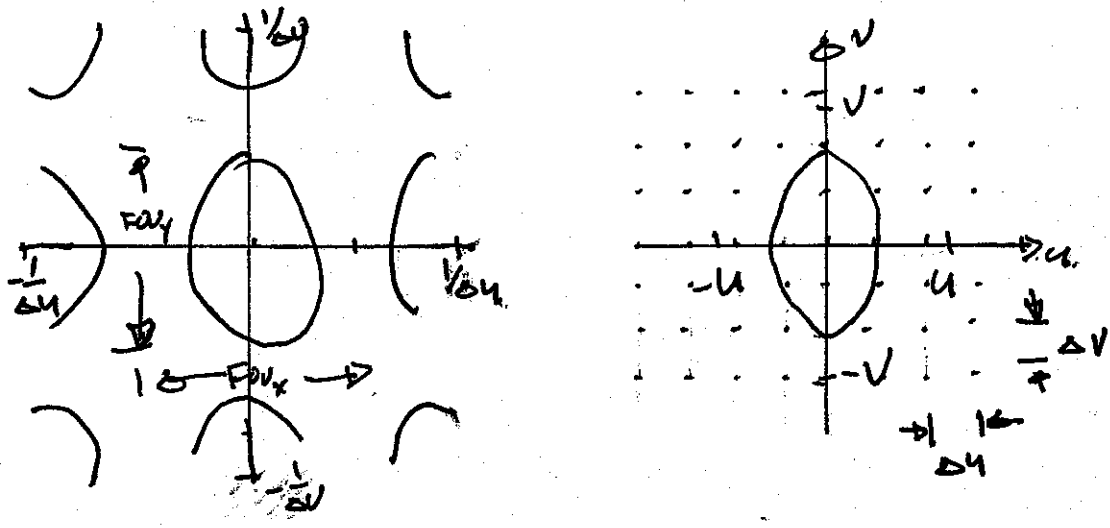
## SAMPLING IN SPACE



$$\frac{1}{\Delta x} > 2u$$

$$\Delta x < \frac{1}{2u}$$

## SAMPLING IN SPATIAL FREQUENCY

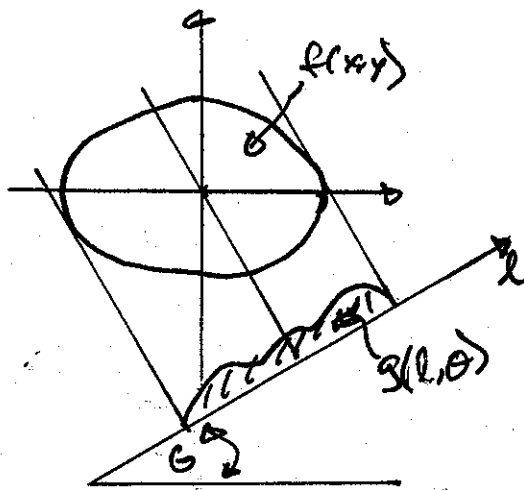


$$\frac{1}{\Delta u} > F_{OVX}$$

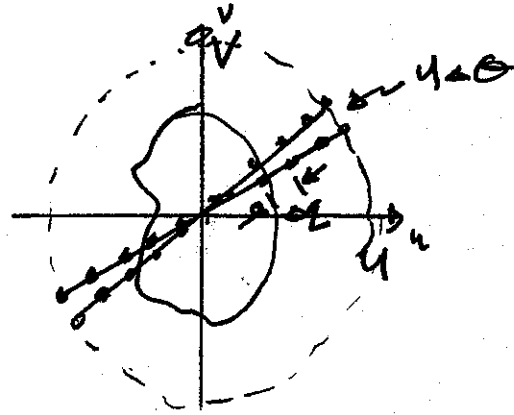
$$\Delta u < \frac{1}{F_{OVX}}$$

# FOR PROJECTION DATA

(9)



SPACE



SPATIAL FREQUENCY

IF  $FOV_x = FOV_y = FOV$ , THEN  $u = v$

FOR A GIVEN  $FOV$ , WE NEED

$$\Delta q \leq \frac{1}{FOV}$$

THIS REQUIRES

$$N_q = \frac{2u}{\Delta q}$$

SAMPLES. AT THE EDGE OF SPATIAL FREQUENCY

WE NEED

$$u \Delta \theta \leq \frac{1}{FOV}$$

WHERE

$$\Delta \theta = \frac{\pi}{N_\theta}$$

THEN

$$\Delta q = u \Delta \theta$$

$$\frac{2u}{N_q} = u \frac{\pi}{N_\theta}$$

$$N_\theta = \frac{\pi}{2} N_q$$

WE NEED  $\frac{\pi}{2} \approx 1.57$  TIMES MORE PROJECTIONS THAN SAMPLES ALONG PROJECTION.

EXAMPLE

WE ACQUIRE 256 SAMPLE PROJECTIONS OVER FOV.

WE THEN NEED

$$N_\theta = \frac{\pi}{2} 256 = 402$$

PROJECTIONS TO MEET NYQUIST REQUIREMENTS.