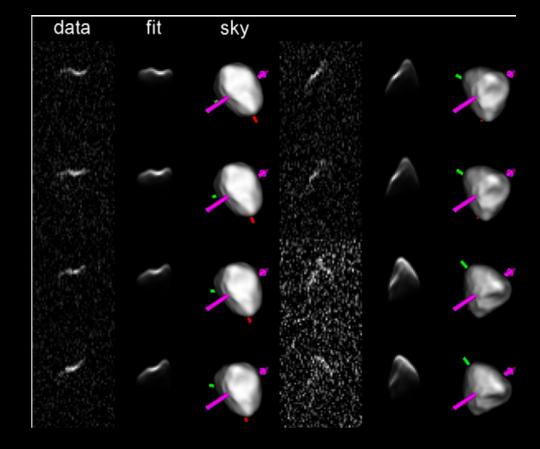
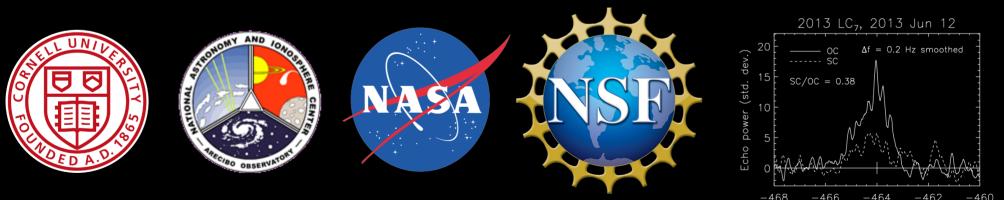
# Uncertainties in Radar-Based Shape Modeling Sean Marshall (Cornell)



(Hz)



Wednesday, June 10, 2015

Future of Planetary Radio Astronomy with Single-Dish Telescopes

# Collaborators

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- Christopher Magri (U. of Maine at Farmington)
- Yanga Fernandez, Jenna Crowell (University of Central Florida)
- Ronald Vervack (JHU APL)
- And others





## How to Study Asteroids?

• Zap them with radar! Measure the echo



#### Arecibo (305 m diameter)

www.naic.edu/public/about/ photos/hires/aoviews.html

#### GBT (100 m diameter)

science.nrao.edu/ facilities/gbt



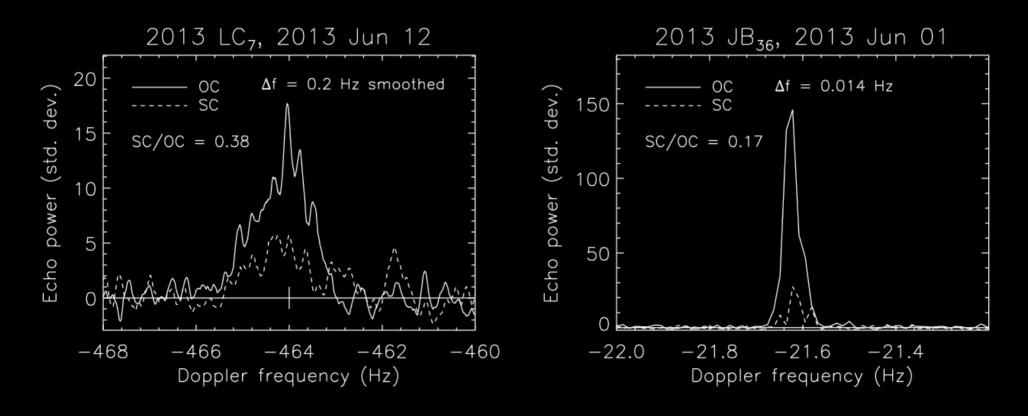


Goldstone (70 m diameter)

en.wikipedia.org/wiki/File: Goldstone\_DSN\_antenna.jpg

## **Measuring Frequency**

- Transmit at a single frequency (CW)
- Receive radar echo at a range of frequencies

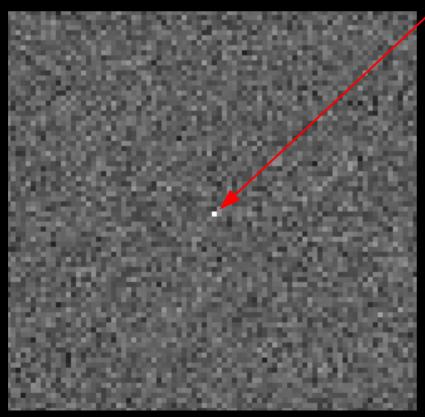


www.naic.edu/~radarusr/2013JB36/

www.naic.edu/~radarusr/2013LC7/

# Measuring Delay (Time)

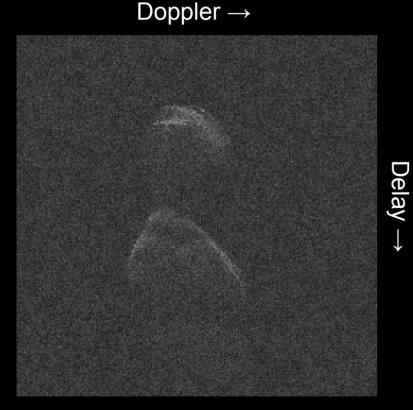
- Measure the length of time between radar transmission and echo reception
  - Measured to microsecond accuracy (or better)
  - Gives range (distance) to asteroid



www.naic.edu/~radarusr/2002GT/

# Measure Both (Time and Frequency)

 Resolve radar echo into time (delay) and (Doppler-shifted) frequency



www.naic.edu/~radarusr/2005NZ6 /apr28.gif



www.jpl.nasa.gov/video/ details.php?id=1359

# Radar "Images"

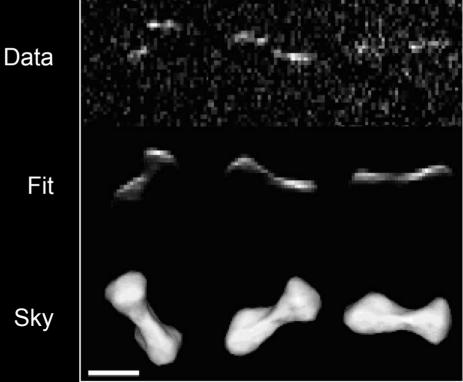
Doppler  $\rightarrow$ 



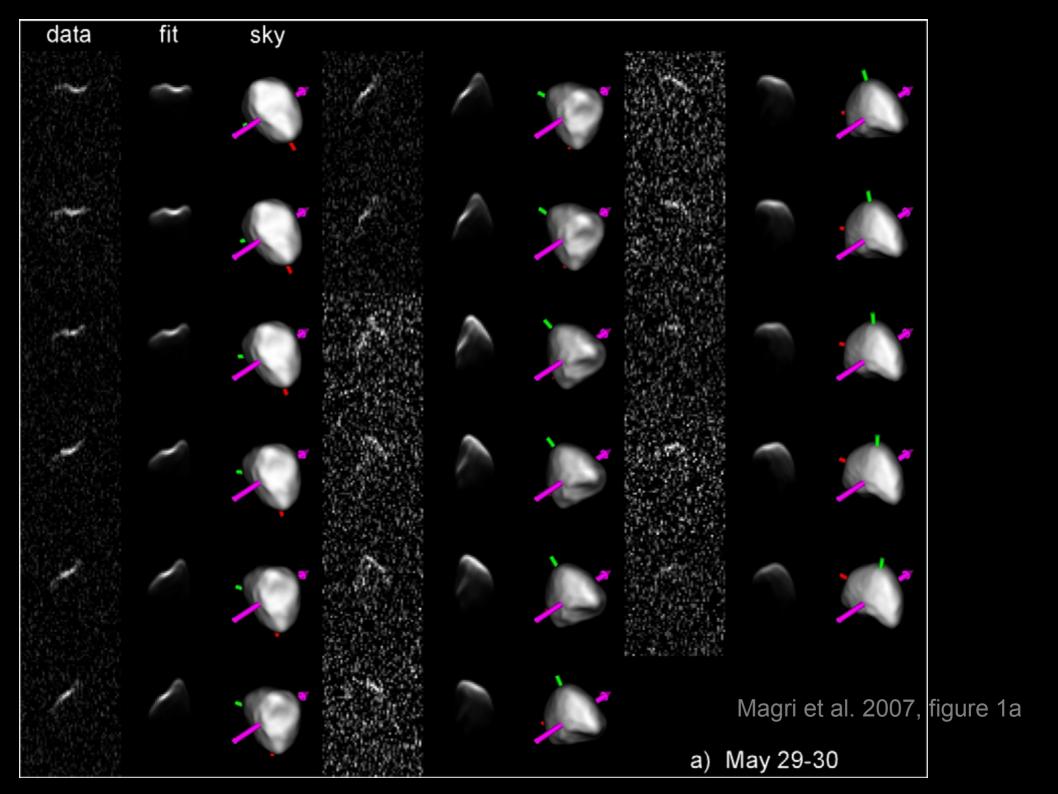
www.naic.edu/ ~radarusr/ 1998QE2/

#### Radar-Derived Shape Models

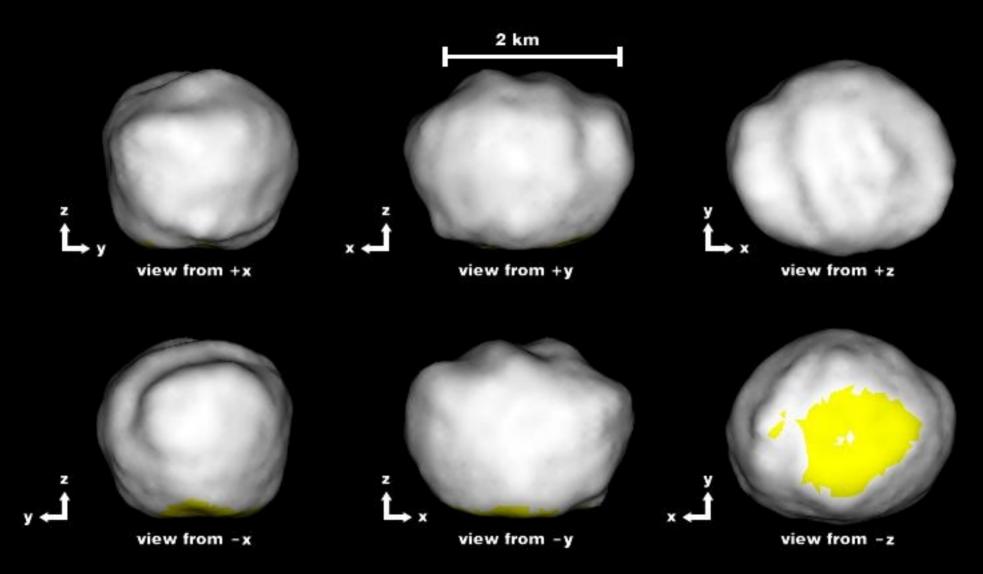
- Inverse problem: Find the shape that best fits the (noisy) observed Delay-Doppler "images"
- Put all observational data into the shape modeling software



www.naic.edu/general/images/SCI ENCE/Planetary/artts/kleo.jpg

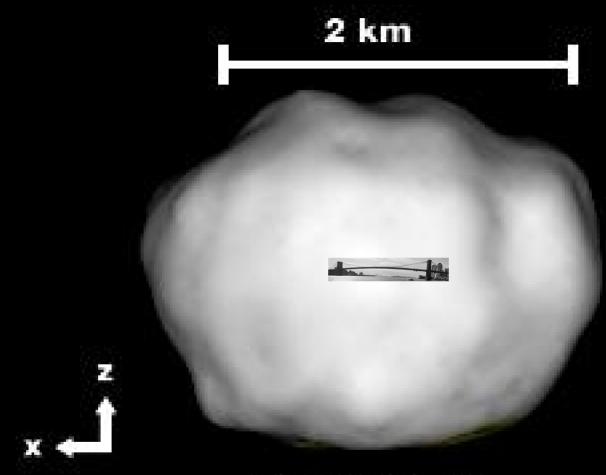


#### (162421) 2000 ET70



• Shape model from Naidu et al. 2013

# (162421) 2000 ET70



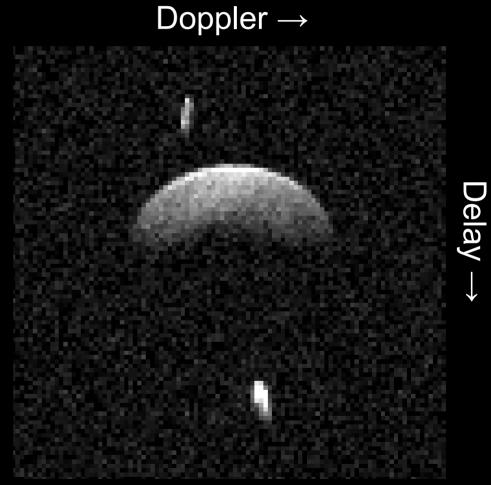
view from +y

https://commons.wikimedia.org/wiki/ File:Brooklyn\_Bridge\_bw.jpg

• With Brooklyn Bridge, for scale

# **Uncertainties in Shape Modeling**

- Radar data have noise
- Noise is not just Gaussian!
  - Real data are more complicated
- Conversion from fits' chi-squared values to parameter error bars is not straightforward



www.news.cornell.edu/stories/ Feb08/AreciboAsteroid.html

# **Uncertainties in Shape Modeling**

- Difficult to determine uncertainties of shape model parameters
  - e.g. size
- Want a rigorous general method
- First step: characterize data uncertainties



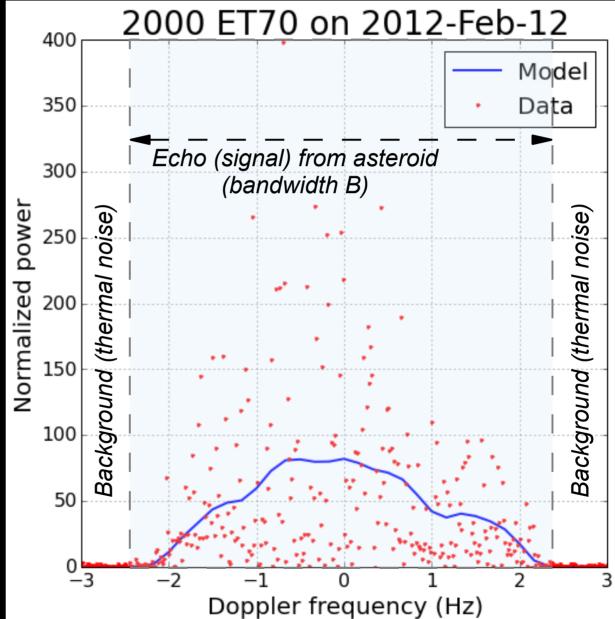


# Frequency (CW) Spectrum

 Bandwidth of asteroid's radar echo constrains its size and rotation state

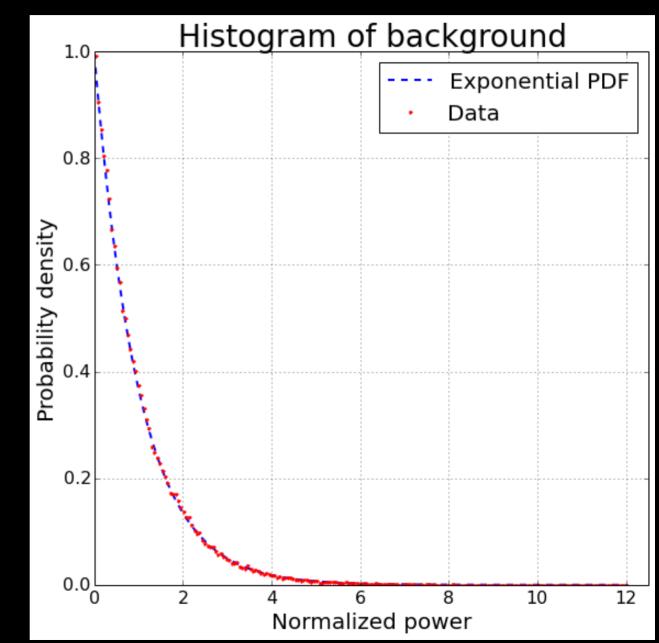
$$B = \frac{4 \pi D \cos \varphi}{\lambda_0 P_{spin}}$$

- Frequency resolution of data is 0.0167 Hz
  - 60 points per Hz



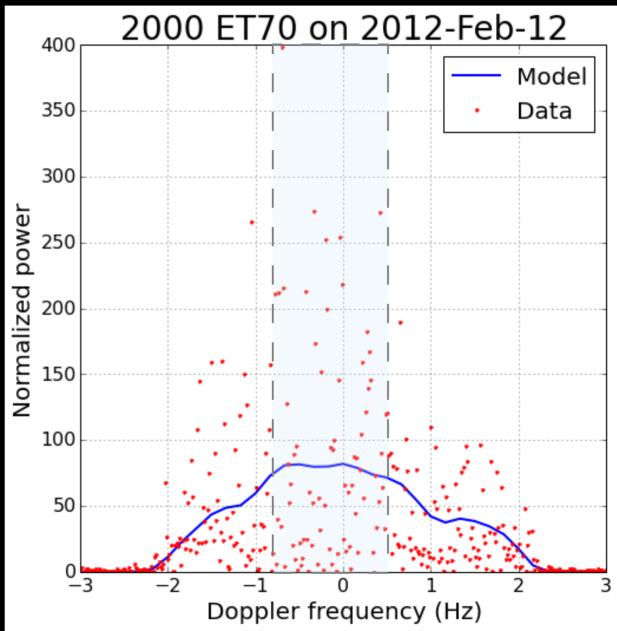
# Statistics of Background Noise

- Values of background noise power follow exponential distribution
  - Mean equals standard deviation
  - So if you know one, you know the other



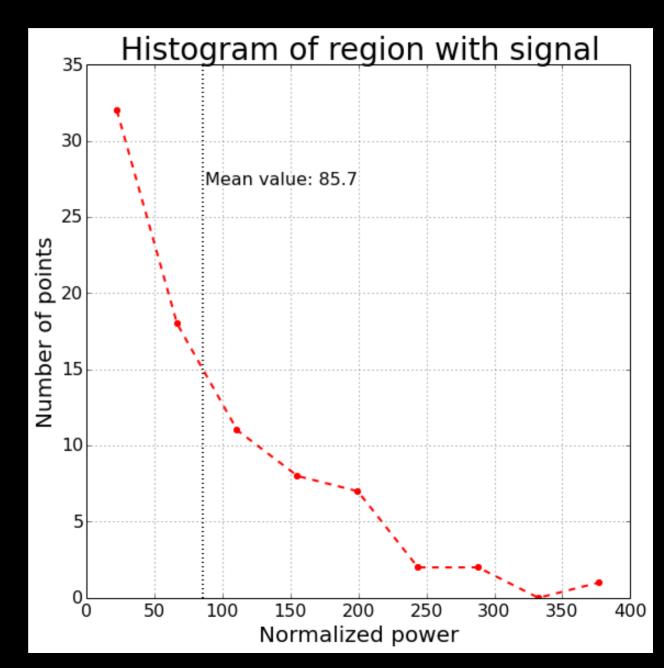
# Statistics of Signal

- Look at a range of frequencies over which the model value (true mean?) is nearly constant
  - To about 10%
- Frequency resolution of data is 0.0167 Hz
  - 60 points per Hz



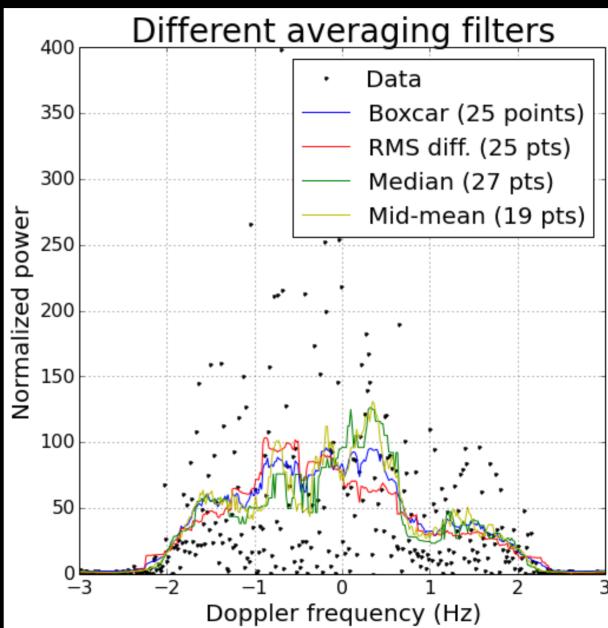
# Statistics of Signal

- Signal values also follow exponential distribution
  - Mean equals std. dev.
- But, mean is unknown
- Want a method to estimate mean; then automate that



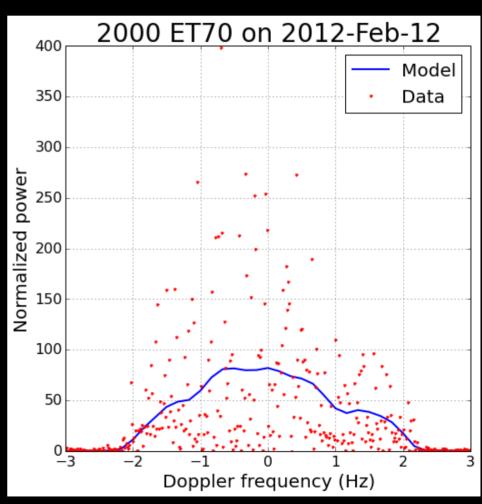
# Filters to Estimate Local Mean

- Try different filters and widths to estimate std. dev. of each data point
  - 25 pts = 0.42 Hz
- Boxcar filter seems best
  - Gives sets of ratios closest to exponential distribution



# Conclusions

- Background noise values in CW spectra follow exponential distribution, as expected
- Signal values also follow exp. distr.
  - But, unknown mean
- Filters to estimate local mean
- Images are more complicated
- First step in improved uncertainty analysis!



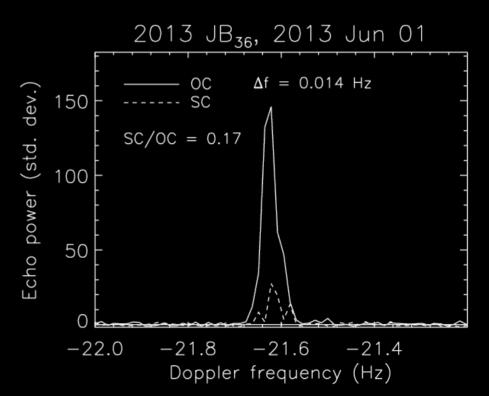
#### Acknowledgments

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- The Arecibo Observatory is operated by SRI International in alliance with Ana G. Méndez – Universidad Metropolitana and the Universities Space Research Association, under a cooperative agreement with the National Science Foundation (AST-1100968). The Arecibo Planetary Radar program is supported by NASA's Near Earth Object Observation program.

# Backup Slides

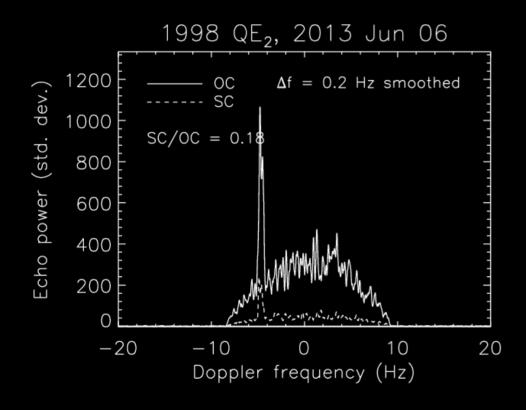
# **Orbit Determination**

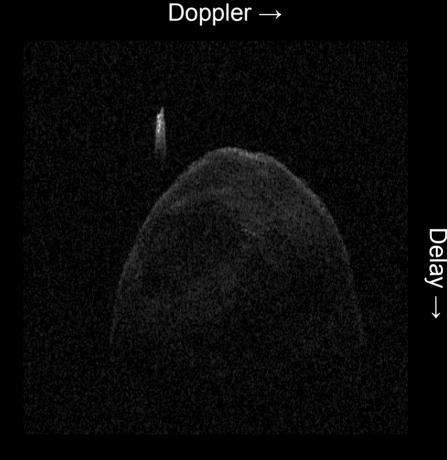
- Dramatic example: 2013 JB36
- Without Arecibo radar observations, it would have been lost after close approach.
- With radar data, its orbit can be accurately predicted over a thousand years into the future!



# Measure Both (Time and Frequency)

- For example: 1998 QE2
  - June 6 and 7, 2013





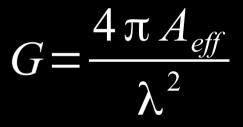
www.naic.edu/~radarusr/1998QE2/

# Radar Equations: Signal

• Power received from radar echo (monostatic):

$$P_{rx} = \frac{G P_{tx}}{4 \pi r^2} \frac{\sigma}{4 \pi r^2} A_{eff} = \frac{G P_{tx} A_{eff} \sigma}{(4 \pi r^2)^2}$$

- P<sub>tx</sub> is transmitted power
- G is system gain (directionality)
- r is the distance to the target
- $\sigma$  is the target's radar cross section  $\sigma = \hat{\sigma} A_{proj}$
- A<sub>eff</sub> is the receiver's effective collecting area



#### **Radar Equations: Noise**

• Noise power:

$$N_{rms} = \frac{k T_{sys} B}{\sqrt{B \tau}} = k T_{sys} \sqrt{\frac{B}{\tau}}$$

- T<sub>sys</sub> is the system temperature (convenient representation of the system's noise)
- $\tau$  is the integration time
- B is the target's (frequency) bandwidth

$$B = v_0 \frac{4 v_{spin} \cos \varphi}{c} = \frac{4 v_0}{c} \frac{\pi D \cos \varphi}{P_{spin}} = \frac{4 \pi D \cos \varphi}{\lambda_0 P_{spin}}$$

#### Radar Equations: Signal and Noise

$$P_{rx} = \frac{G P_{tx}}{4 \pi r^2} \frac{\sigma}{4 \pi r^2} A_{eff} = \frac{G P_{tx} A_{eff} \sigma}{(4 \pi r^2)^2}$$

en.wikipedia.org/wiki/ File:Goldstone\_DSN \_antenna.jpg

$$N_{rms} = \frac{k T_{sys} B}{\sqrt{B \tau}} = k T_{sys} \sqrt{\frac{B}{\tau}}$$

$$SNR = \frac{P_{rx}}{N_{rms}} = \frac{GP_{tx}A_{eff}\sigma\sqrt{\tau}}{(4\pi r^2)^2 kT_{sys}\sqrt{B}}$$





www.naic.edu/public/ about/photos/hires/ aoviews.html