

# Analyzing data on a cosmic scale

## Prof. Rachel Bean (Astronomy)



# How big is our universe?

1 light second

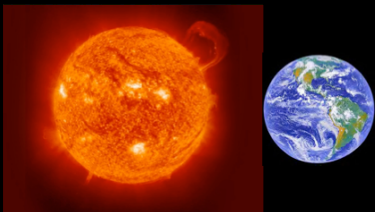


4 light years

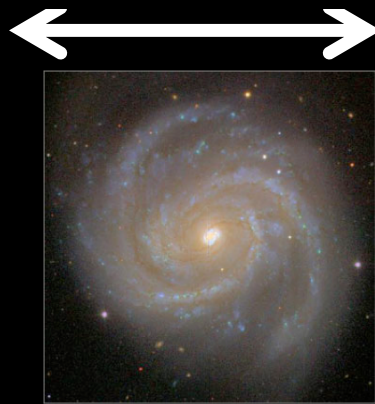


Observable universe  
~billion light years

8 light minutes



~100,000 light years



5 light hours

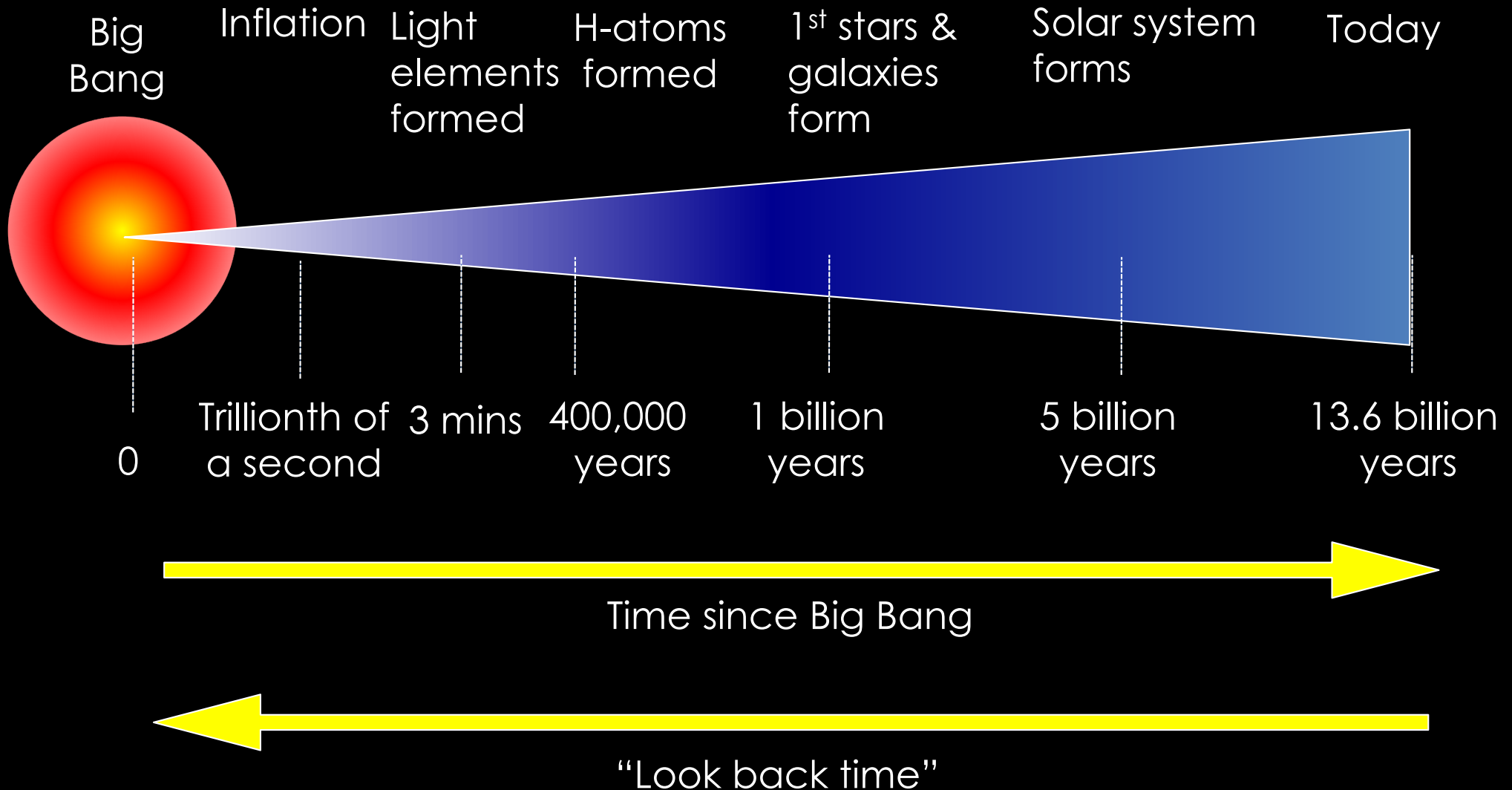


~million light years





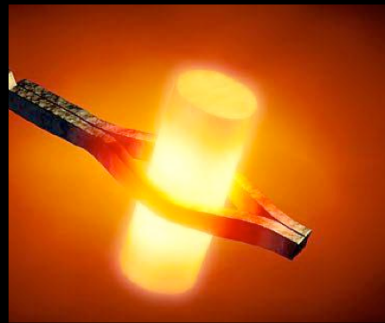
# Distant objects tell us about cosmic history



# What type of data do we take?

Measure properties of luminous objects e.g. gas clumps, planets, stars, stellar remnants, galaxies, galaxy clusters

- Positions
- Temperatures/colors
- Brightness
- Images
- Spectra





# How do we use the data?

- Use observations with known laws of physics to infer properties of the universe
  - Geometry
  - Size
  - Matter constituents
  - Origin and Evolution history
- Distances are critical, but are the hardest quantity to infer: obtained indirectly, using geometry

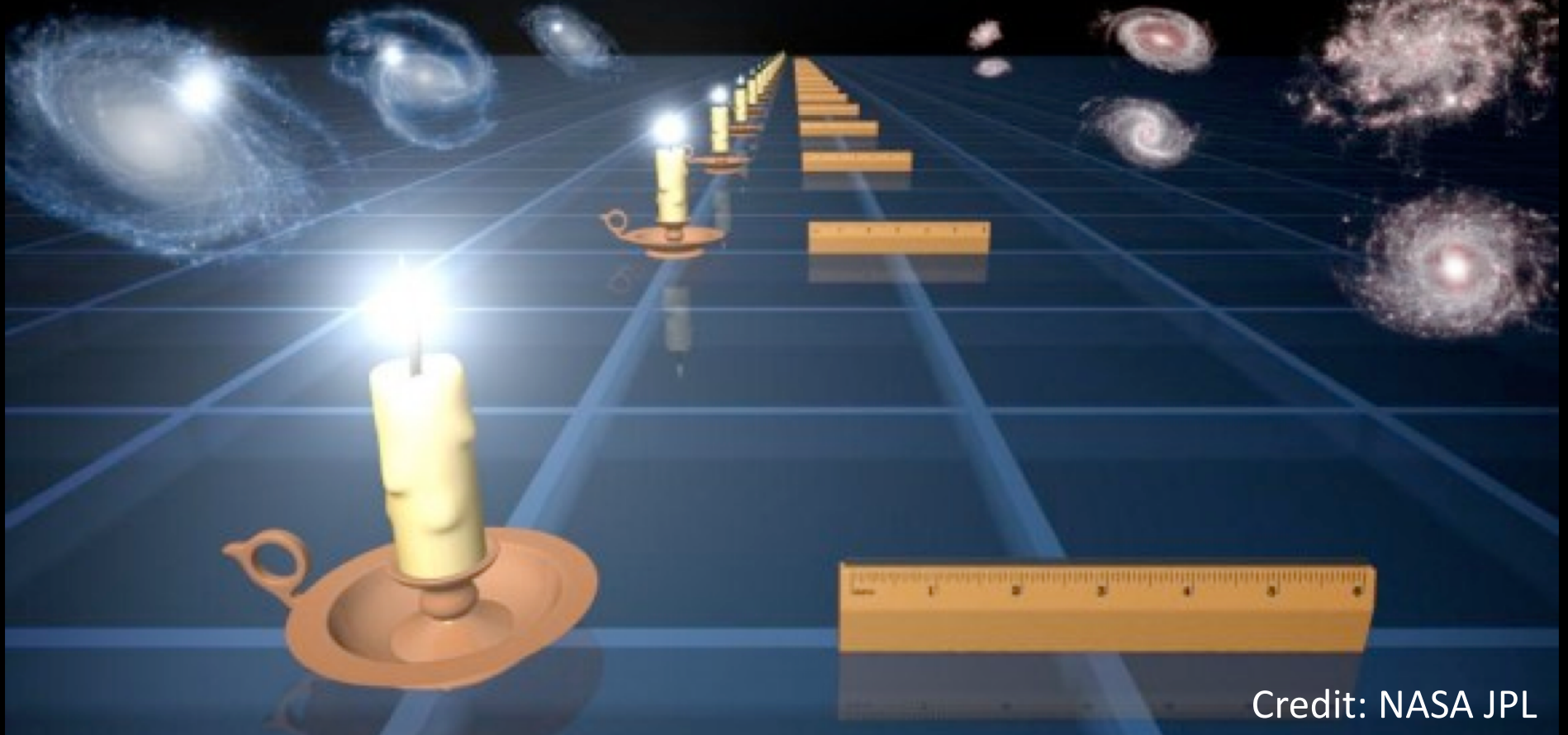
# Cosmic Depth Perception

## Standard Candles

Compare known intrinsic and observed brightness

## Standard Rulers

Compare known physical and observed size

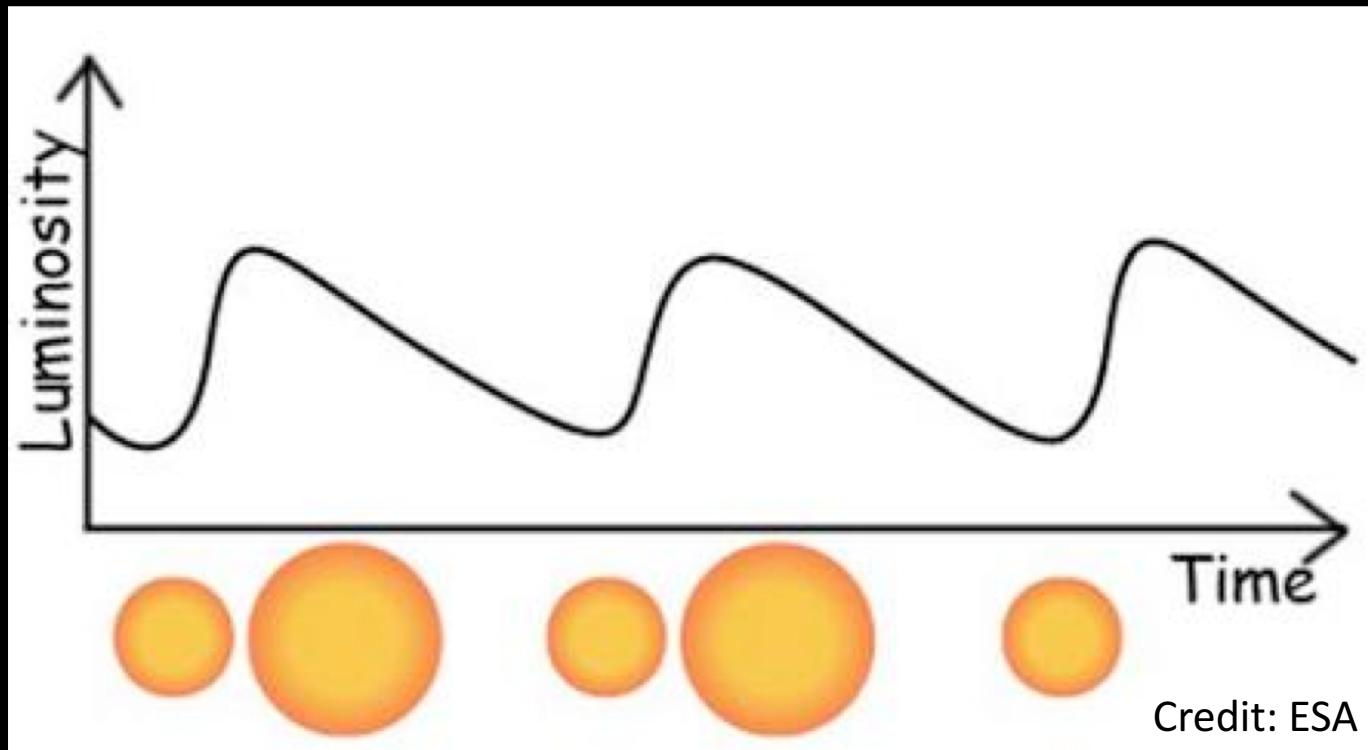


Credit: NASA JPL

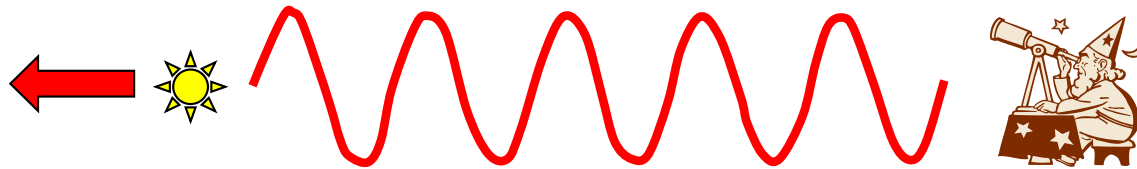
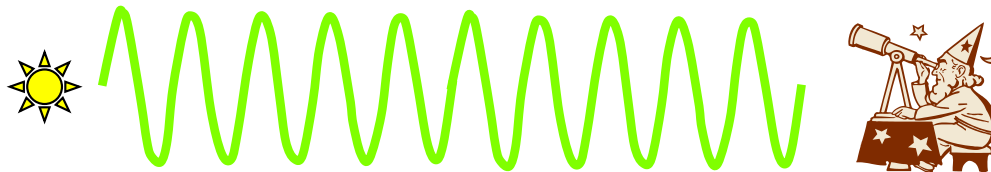
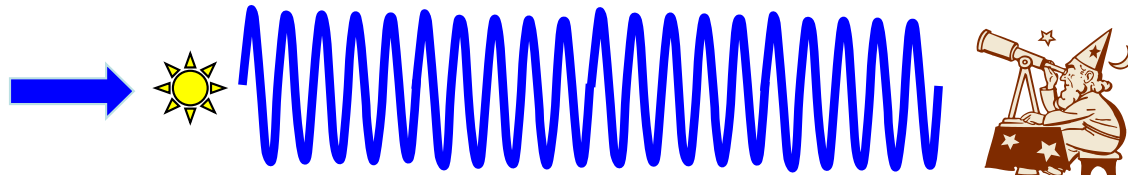
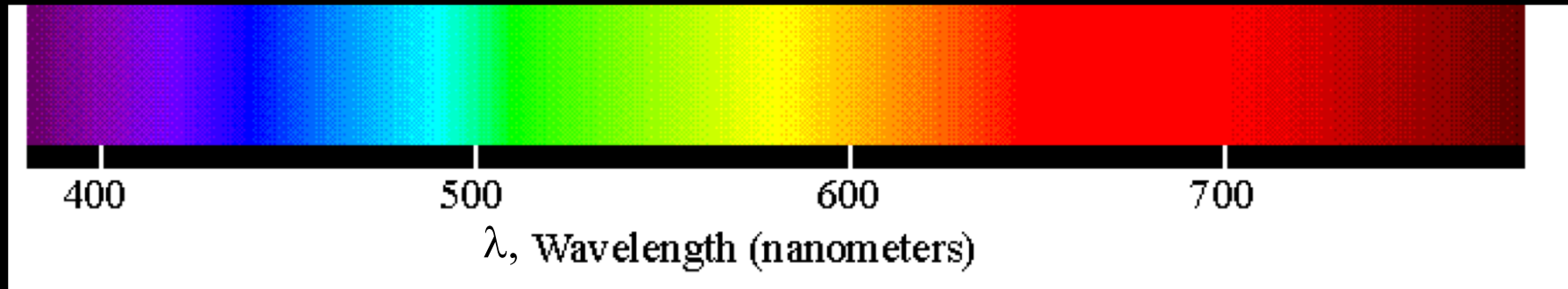


# Standard candles: Cepheid Variable Stars

- "Middle-aged" pulsating stars
- Pulsation period directly related to their luminosity
- 100 x brighter than Sun (see ~million light yrs away)



# Use Doppler shift to measure cosmic motion

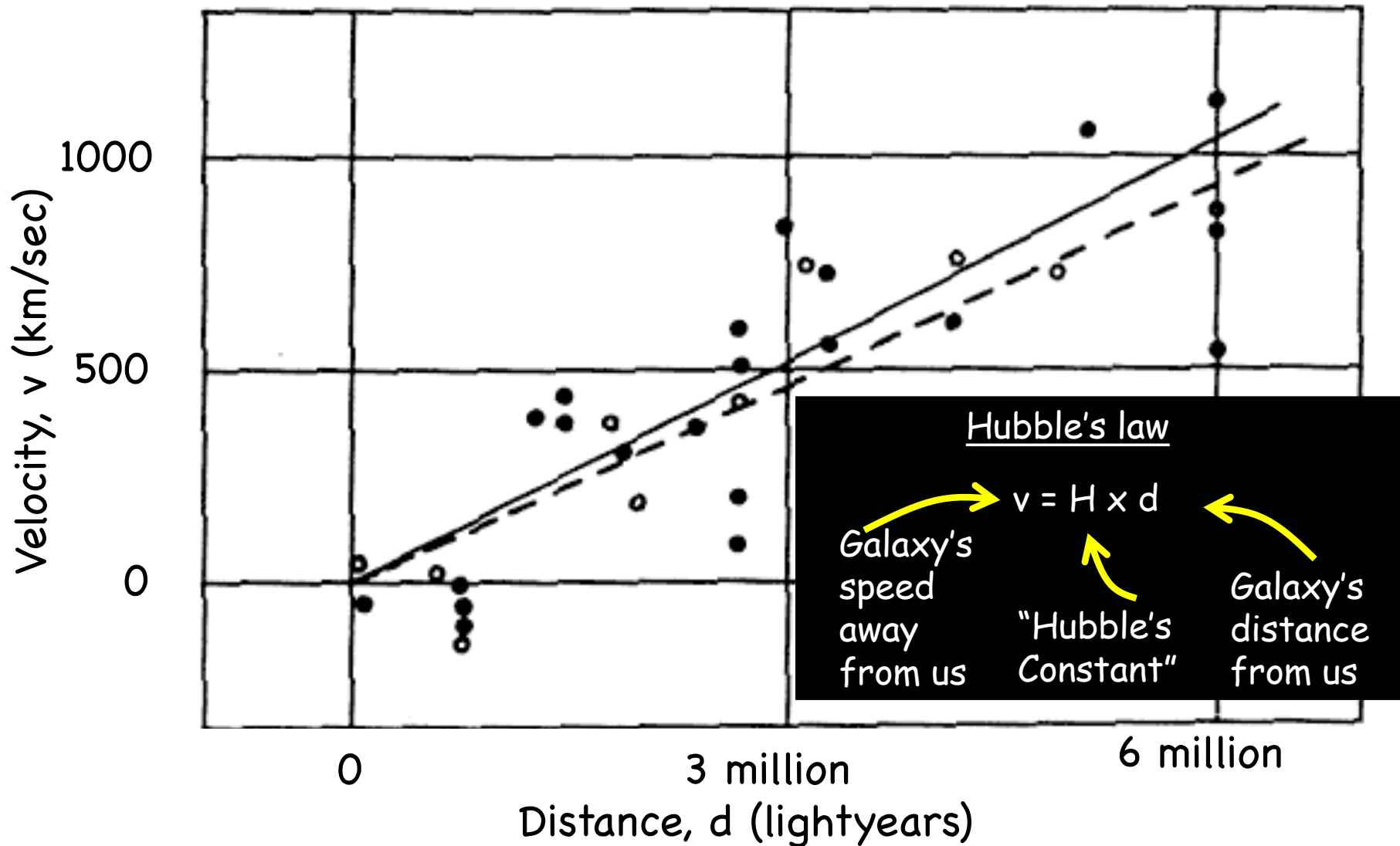


$$\frac{\Delta\lambda}{\lambda} = \frac{v}{c}$$



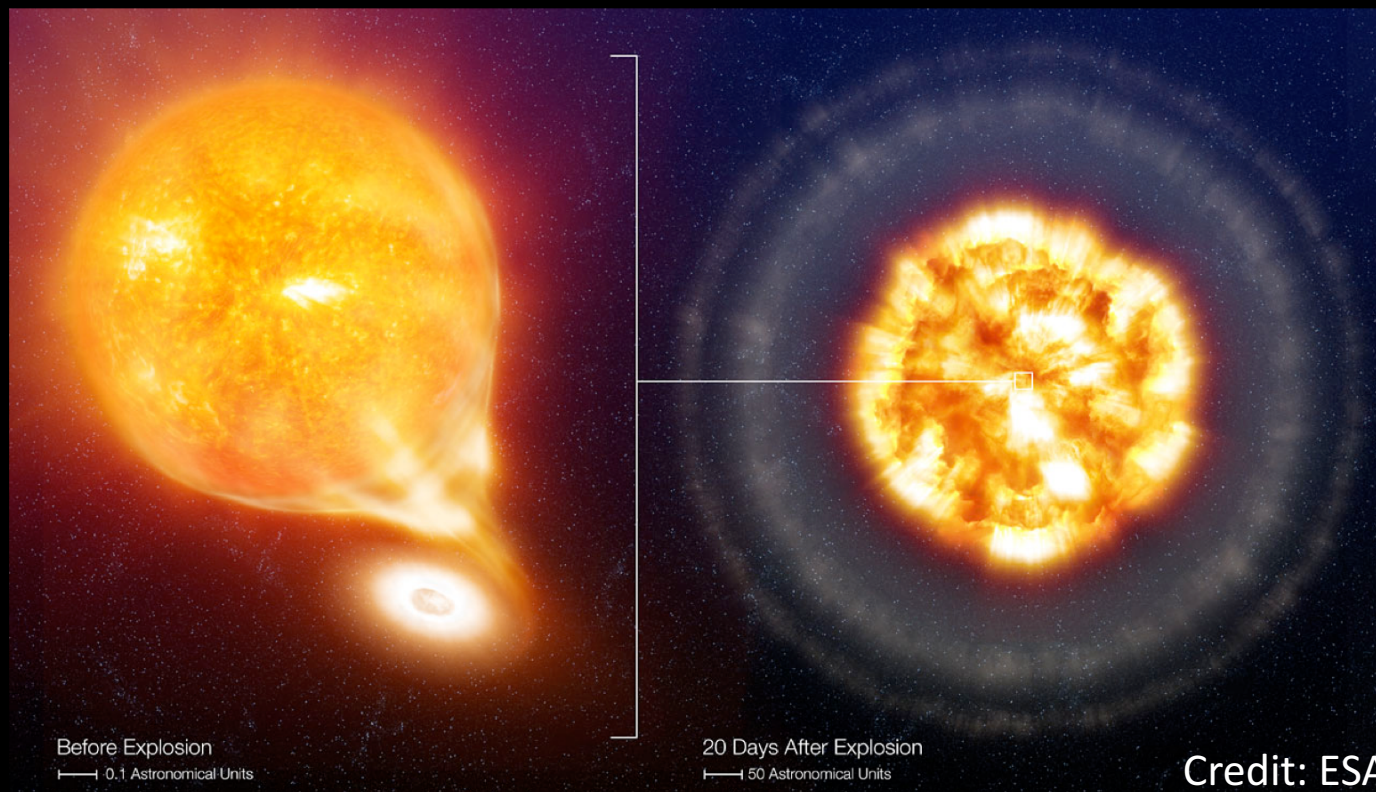


# Hubble's Law (1929): Evidence for cosmic expansion



# Standard candles: Type 1a Supernovae

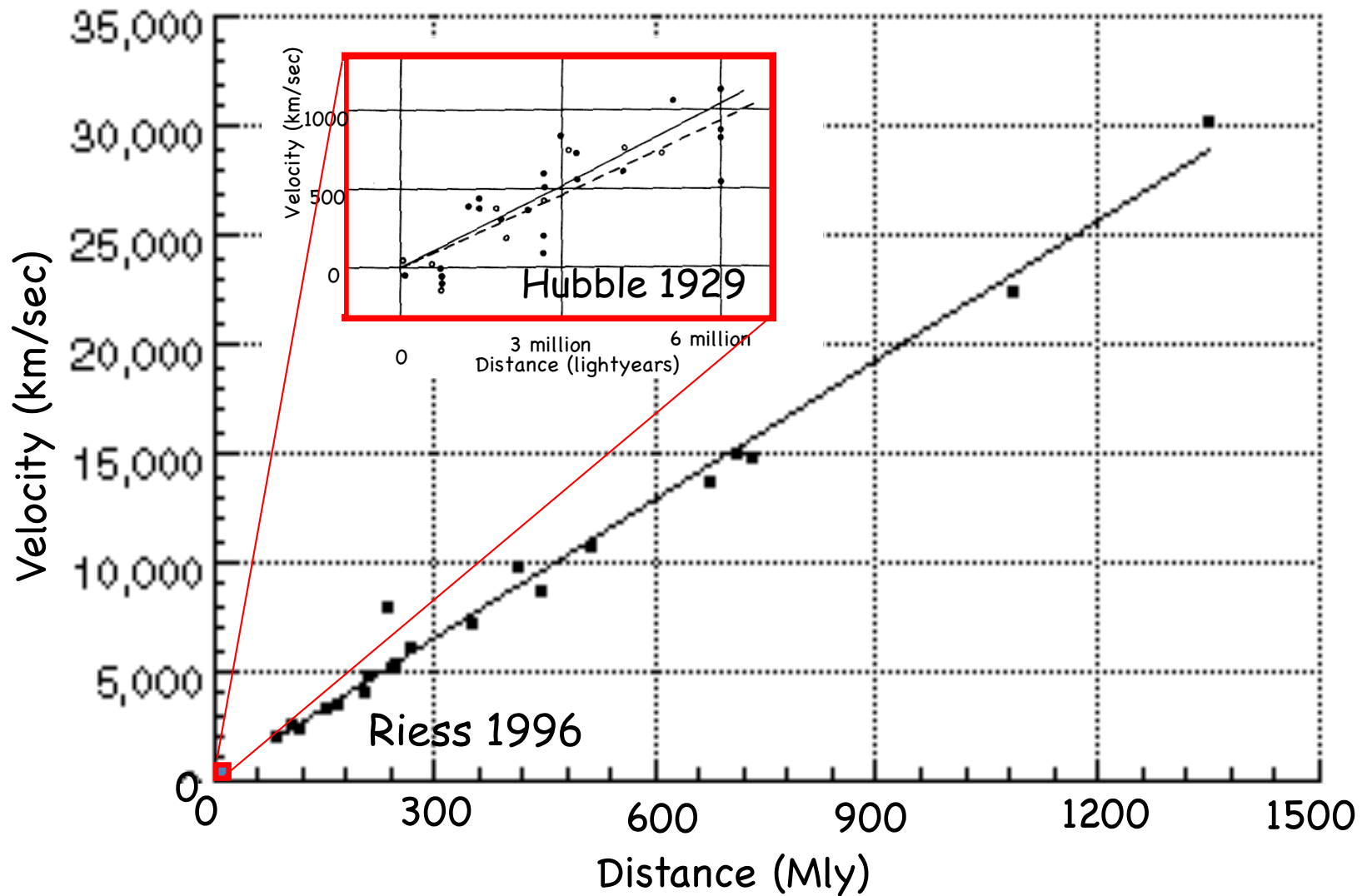
- Dead star accreting from its companion
- Rate of decline in brightness related to peak luminosity
- 5 billion x brighter than Sun (see billions light yrs away)





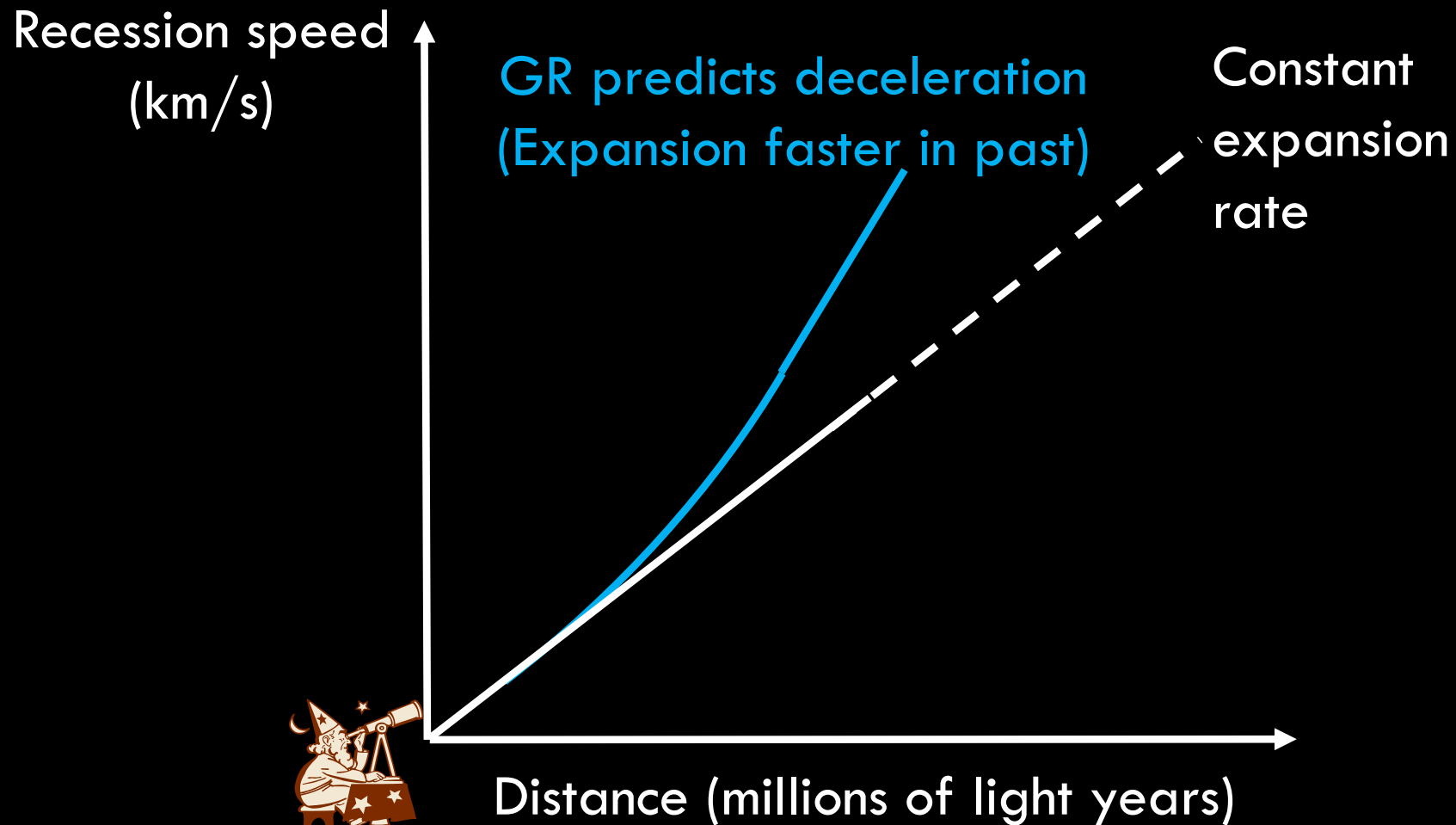
# Hubble's law: the modern day version

Observations of distant Supernovae



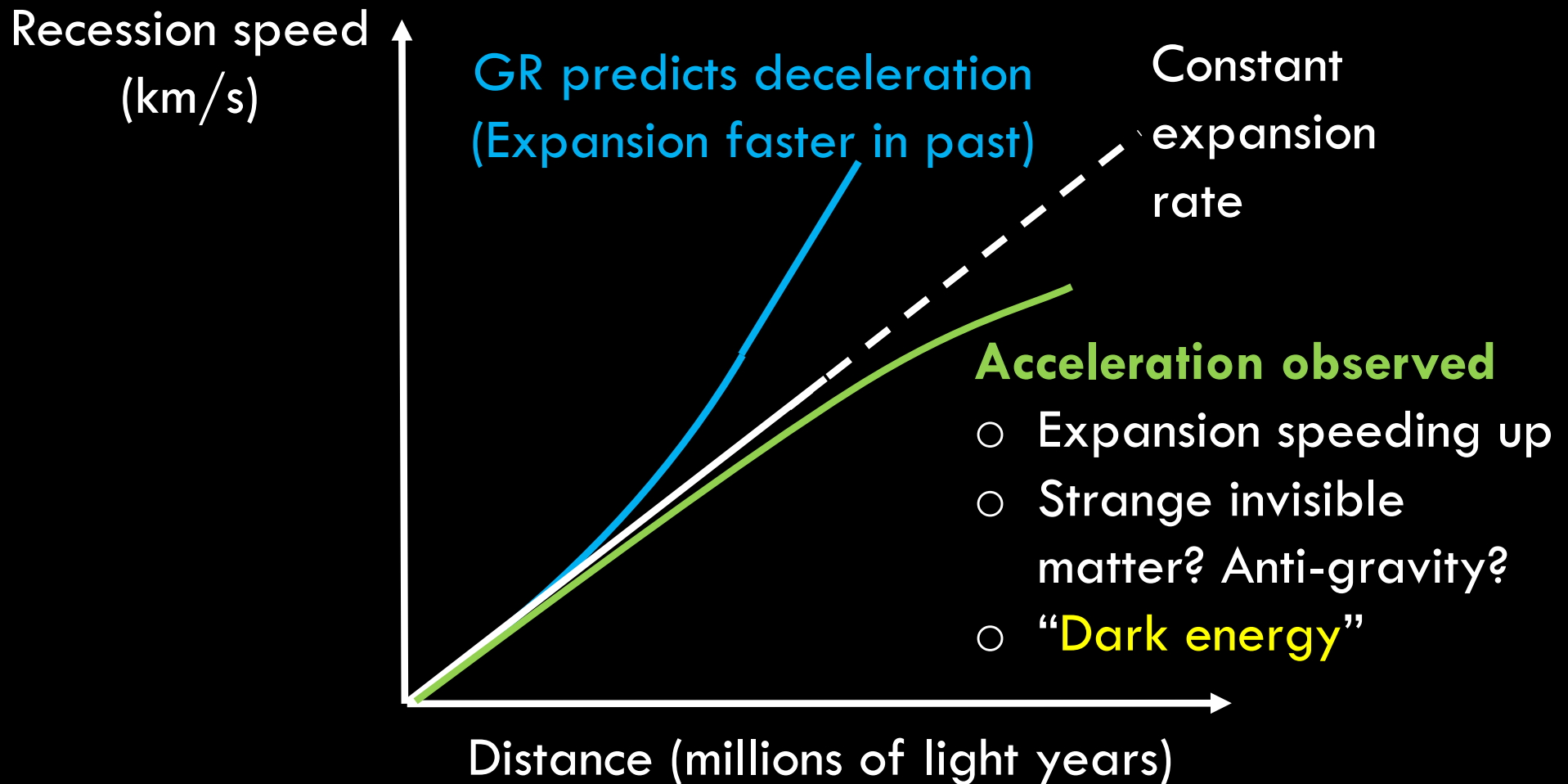
# Interpreting the cosmic expansion history

## Hubble Diagram



# Interpreting the cosmic expansion history

## Hubble Diagram





Get more data, ask more questions...

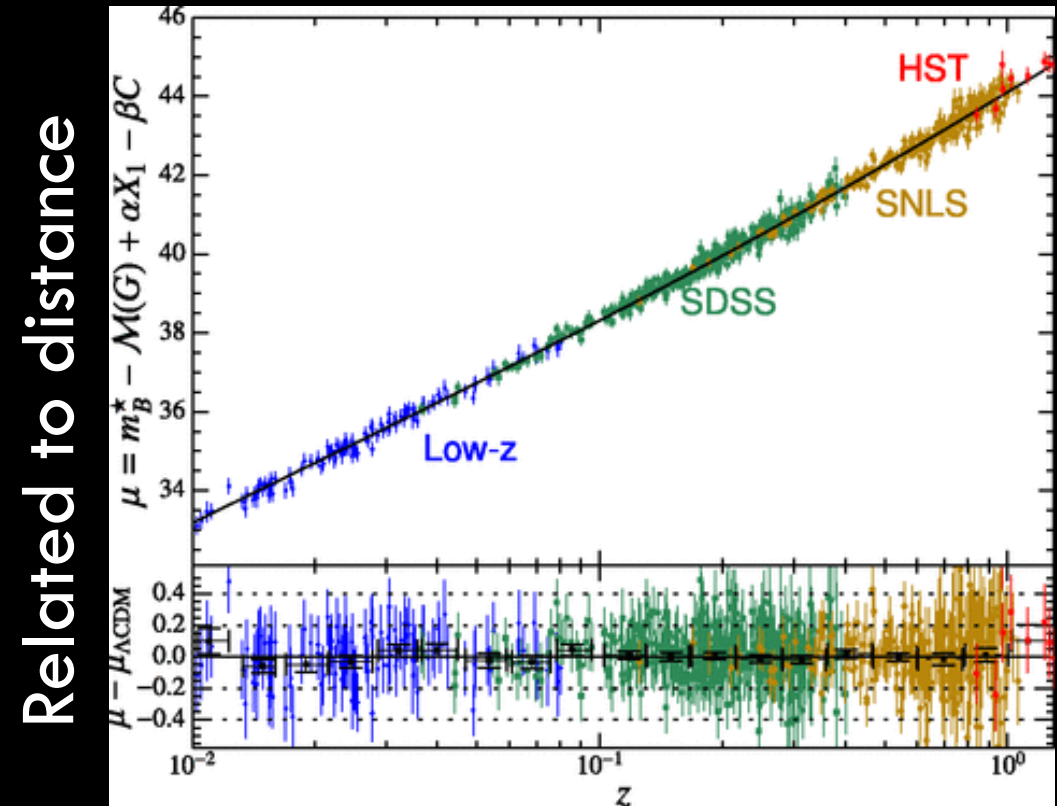


# More data: More constraining power

## Statistical uncertainties:

Random variations in sample

- Variance  $\sim 1/\text{sample size}$
- Examples for SN1  $\alpha$ :
  - Random instrument noise
  - Random variations in SN1  $\alpha$  luminosity



Credit: Betoule et al 2014

*Astron Astrophys* 568(A22):22–53

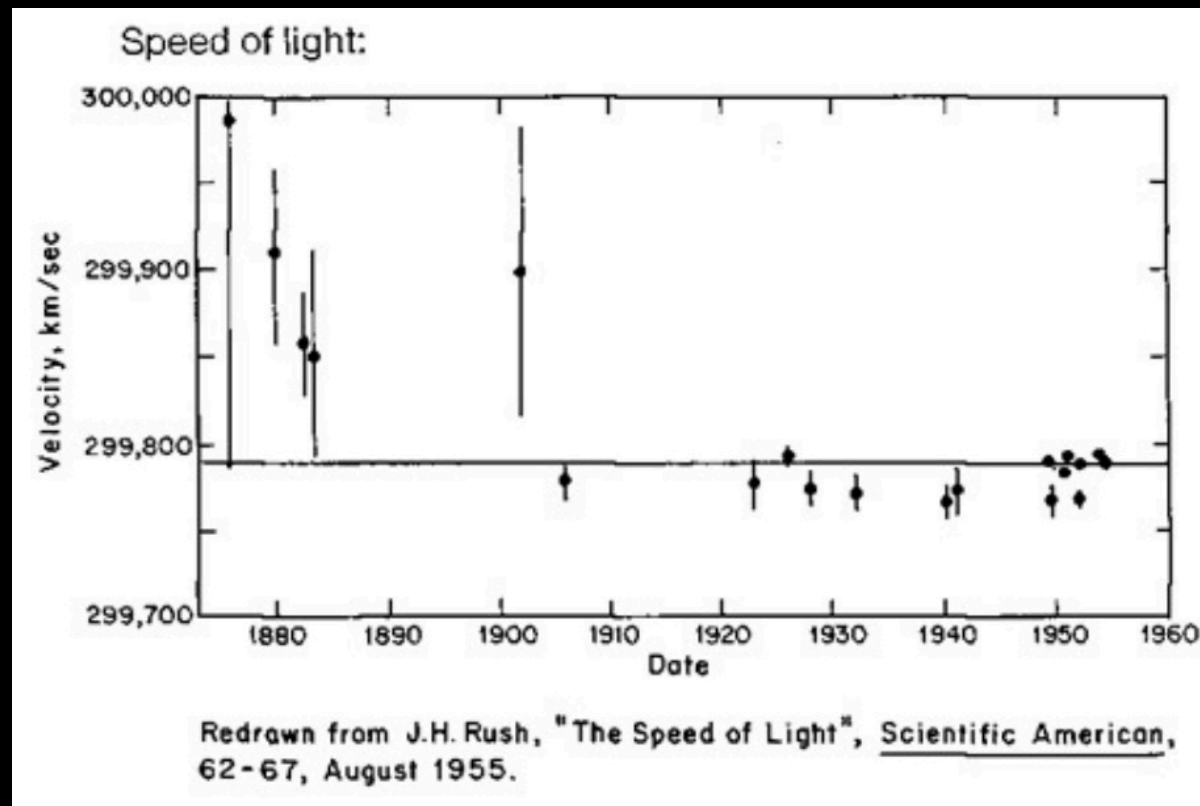
# More data: More complexity

## Systematic uncertainties: Non-random variations

- Errors persist as increase sample size
- Examples for SN1a:
  - Offsets/miscalibration in instrument response or between surveys
  - Survey selection biases
  - Light extinction by dust in the Milky Way
  - Contamination by misclassified non-SNIa events
- Approach
  - Conduct “null tests”: tests that should be consistent with zero, independent of parameters for hypothesis you are testing
  - Model and remove systematic effects, where identified
  - “Marginalize” over “known unknowns” to include them in errors.

# Another peril: Confirmation Bias

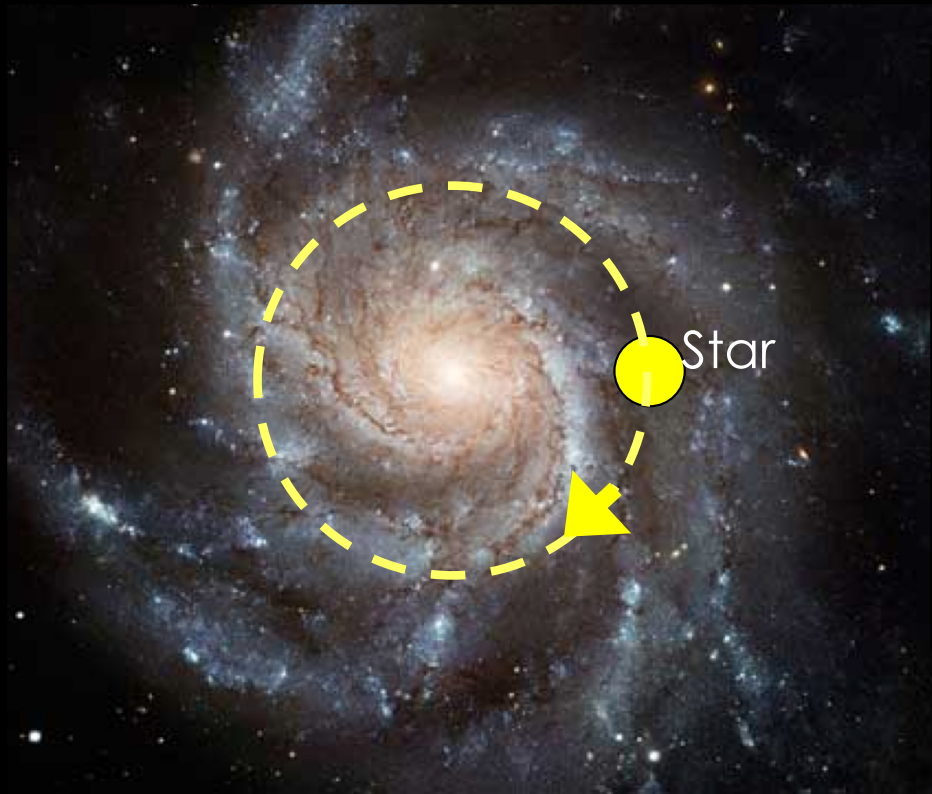
Presuming you know the answer when analyzing data.



Avoid by conducting a “**blinded analysis**” of the data



# “Weighing” galaxies using galaxy rotation



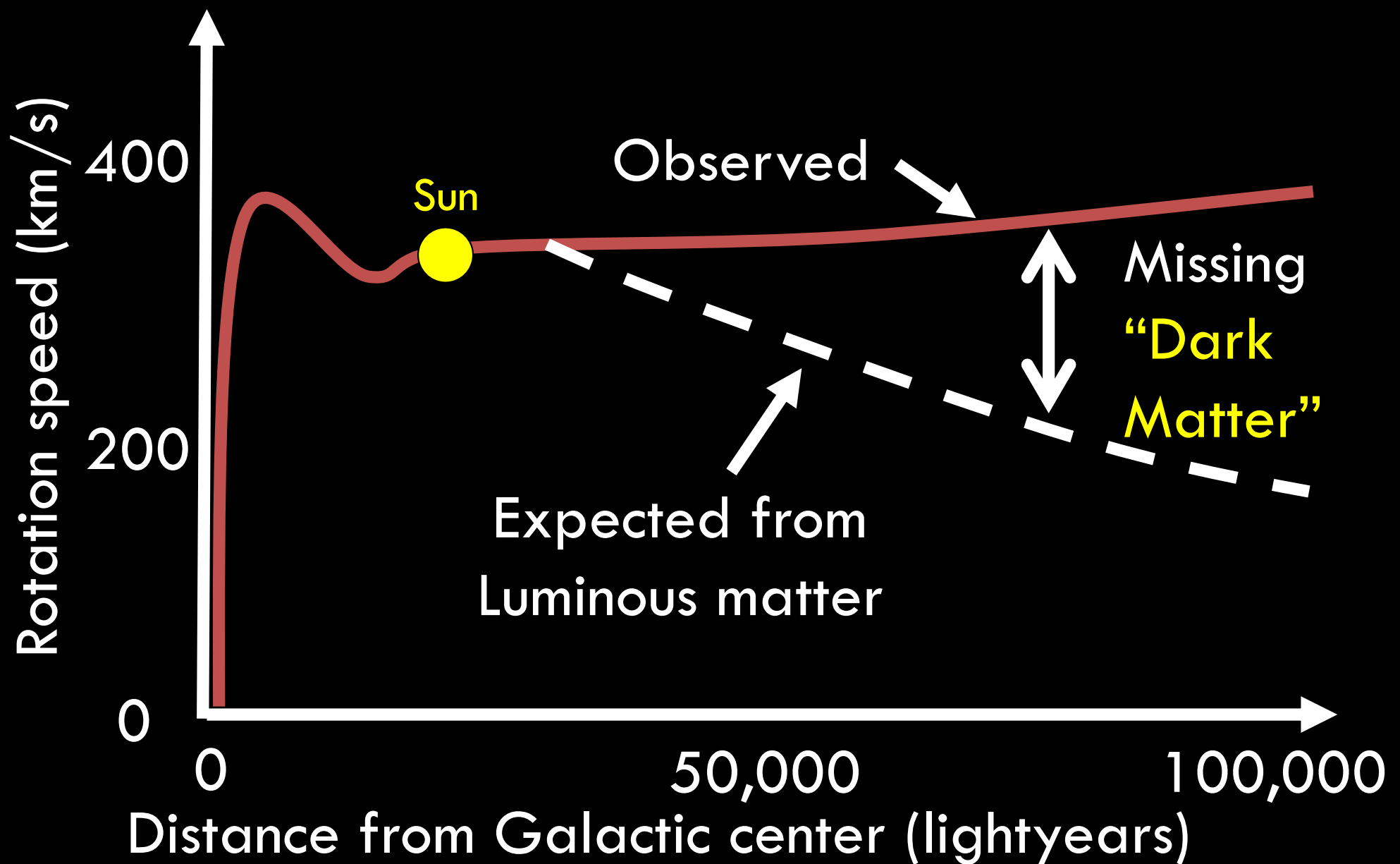
Newton's Law applies to  
stars in galaxy

Newton's  
constant  $G$  ← Mass of  
Galaxy  
within orbit

$$v^2 \approx \frac{GM}{r}$$

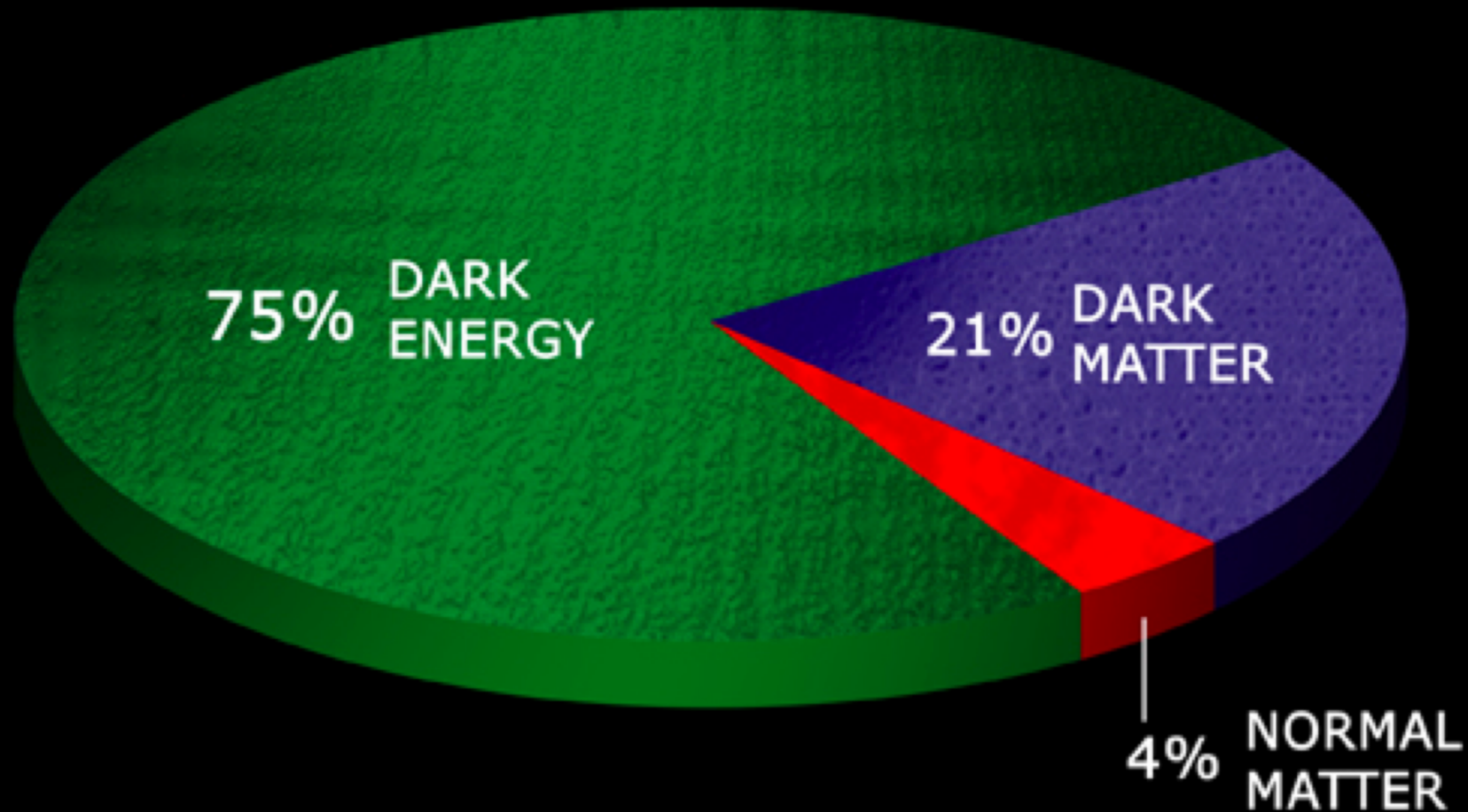
Star rotation  
speed ←  $v$   
Distance  
to galaxy  
center ←  $r$

# Puzzling observations: Invisible matter?



# The cosmic challenge

- 96% of universe's matter is unlike anything on Earth
- And/or we don't understand how gravity works



# Large Synoptic Survey Telescope (LSST)

Optical telescope in Chile, “first light”  
in 2019

3D cosmic map over a billion lyrs

- 10 billion galaxies
- 10 billion stars with redshift
- 1 million supernovae

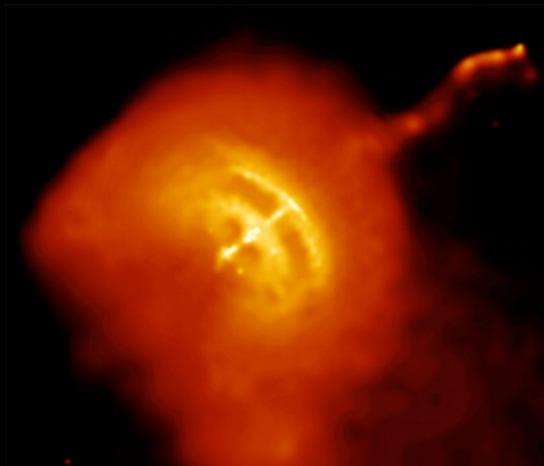
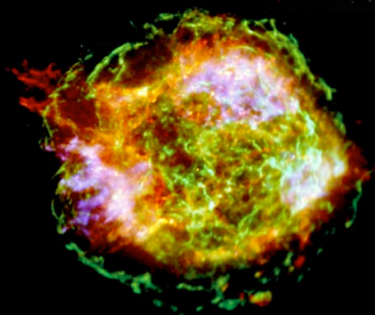
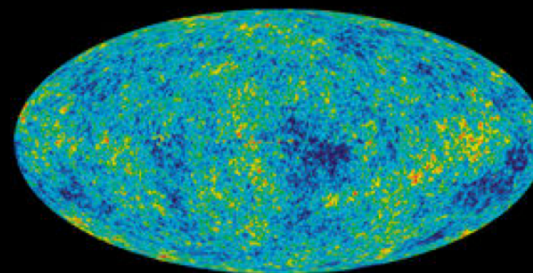
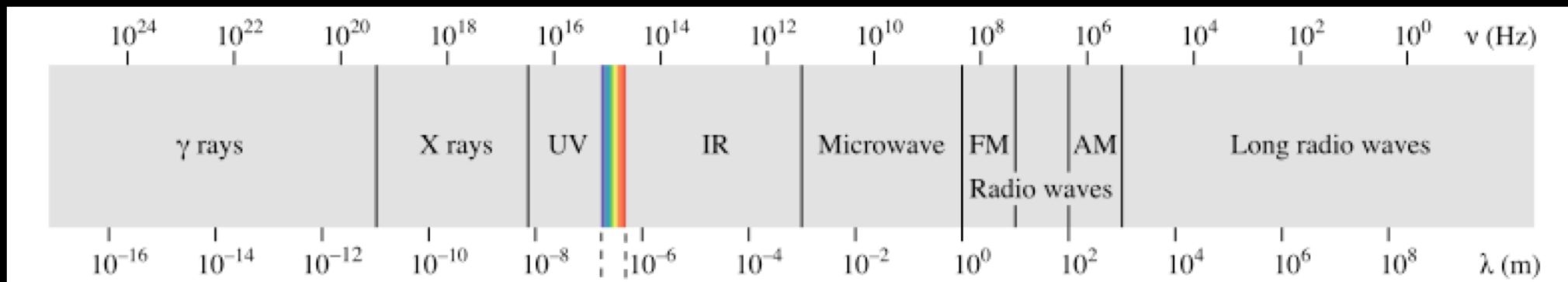
>10-fold improvement in dark  
energy & dark matter constraints

A data challenge both in size and  
complexity: Petabytes of data

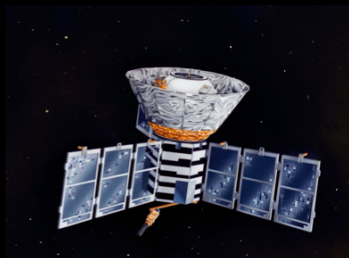
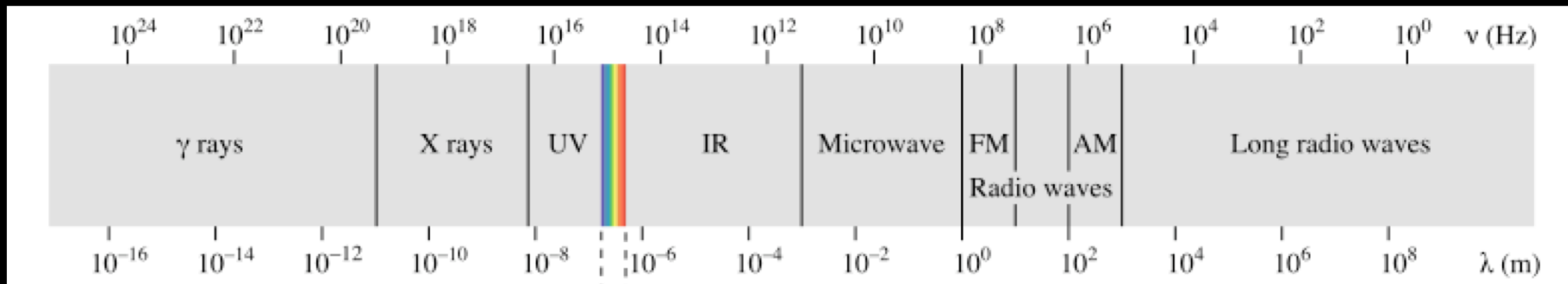




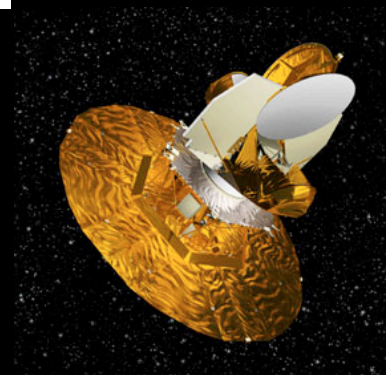
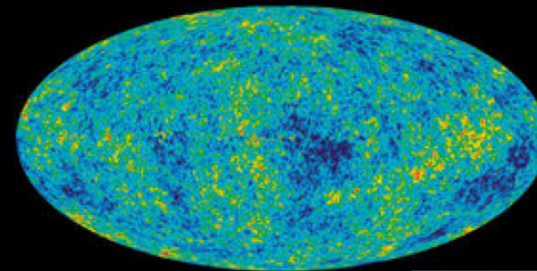
# Different wavelengths probe very different cosmic environments



# Different wavelengths probe very different cosmic environments



COBE 1989-93



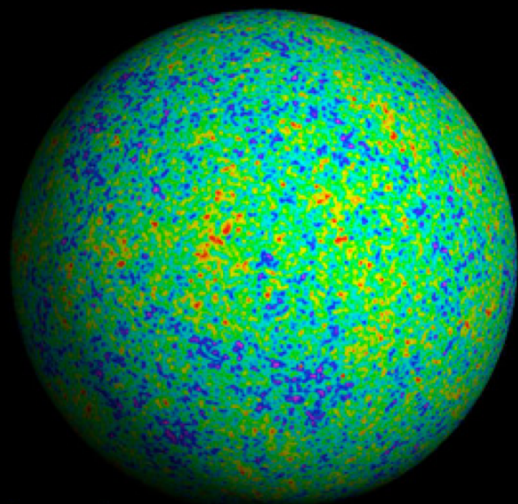
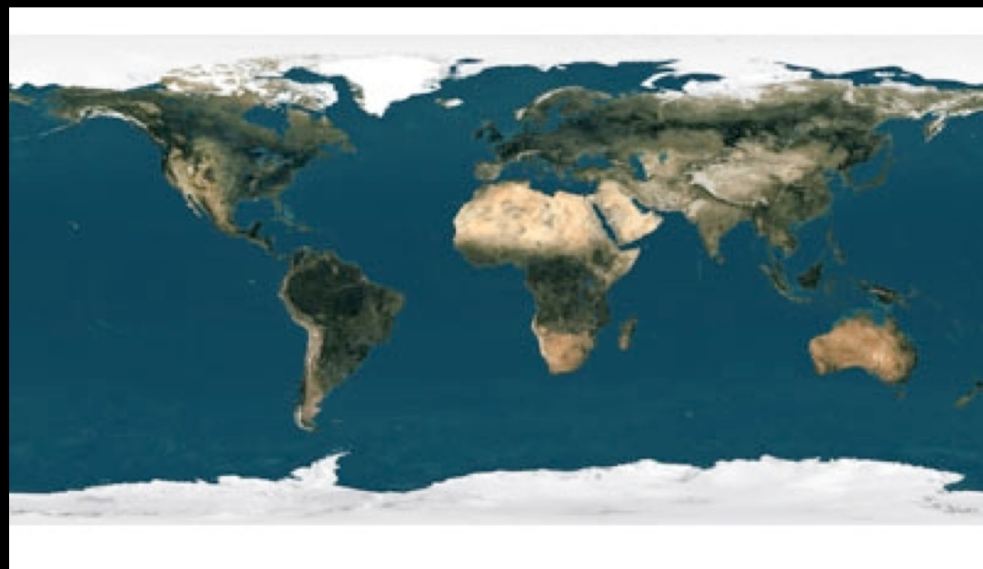
WMAP 2001-10



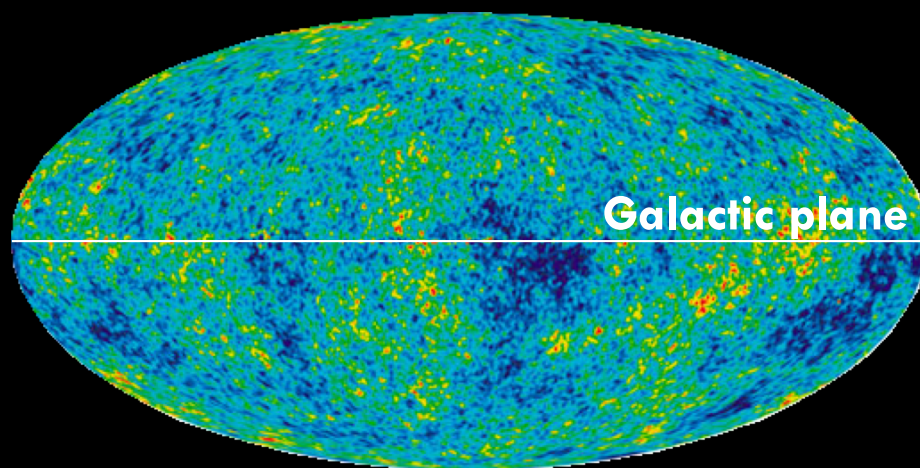
Planck 2009-13



# Looking at the microwave sky map



Tegmark



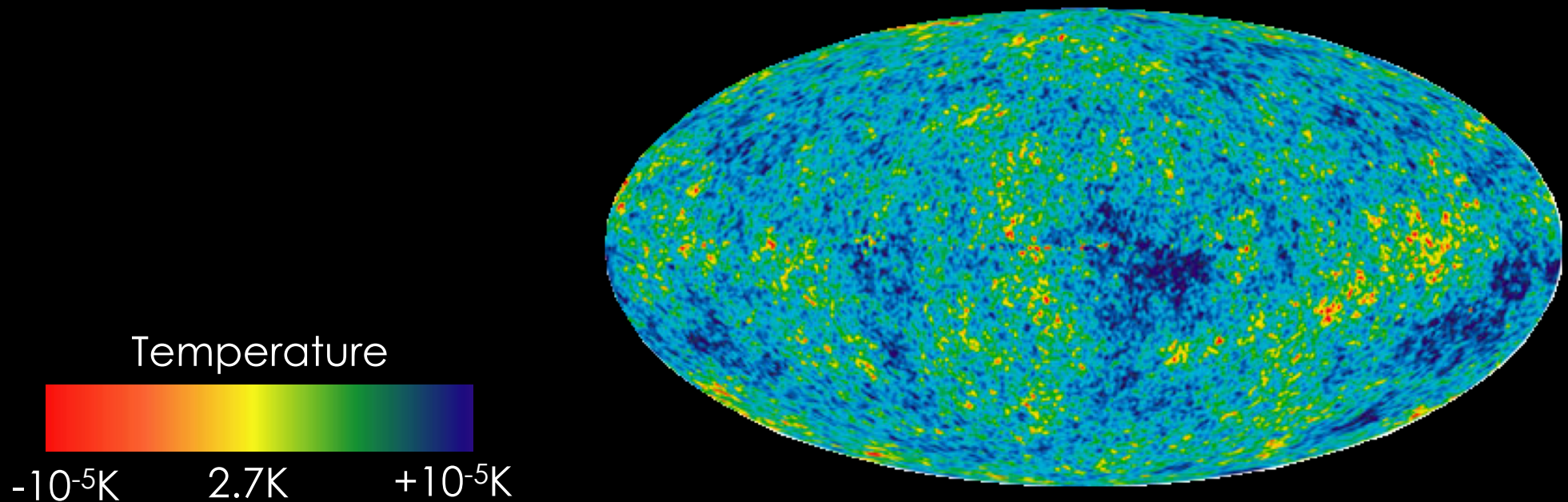
# The Cosmic Microwave Background (CMB)



A fossil remnant, light emitted 400,000 yrs after the Big Bang

The light has the same temperature across the whole sky.

How can this be?? The “Horizon Problem”.





# An ant on a balloon analogy



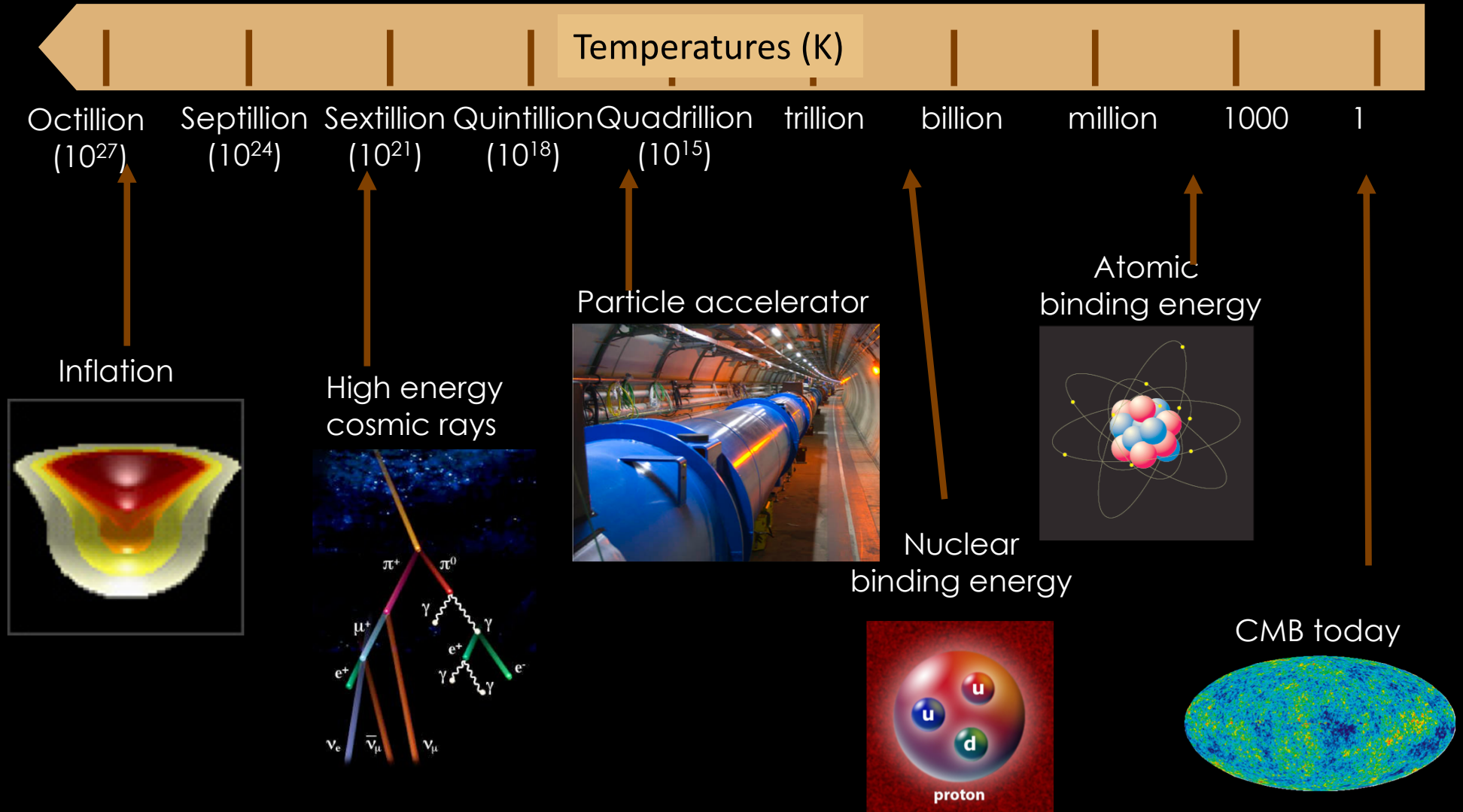
# An ant on a balloon analogy



CMB data motivated new cosmological model:  
Cosmic Inflation – superluminal expansion!!

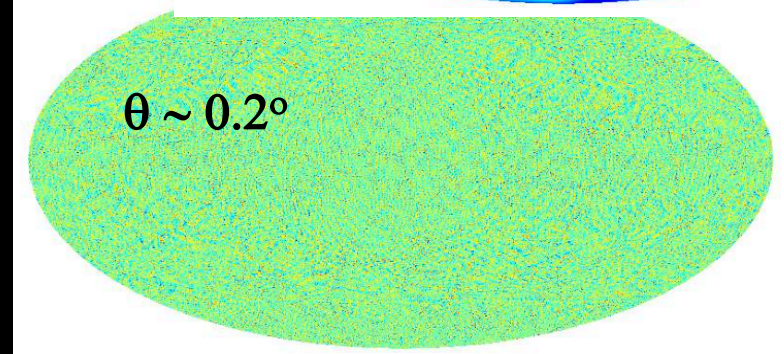
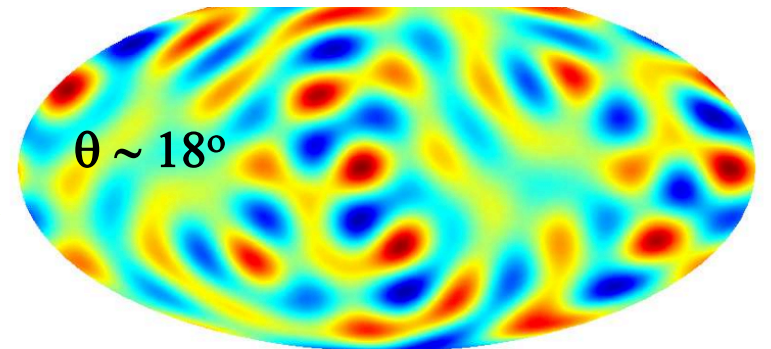
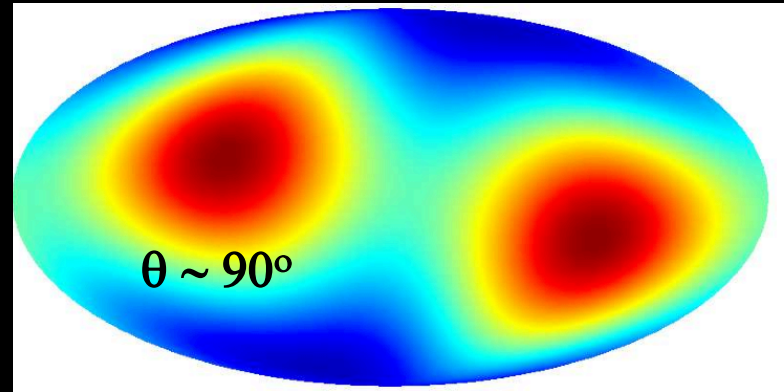
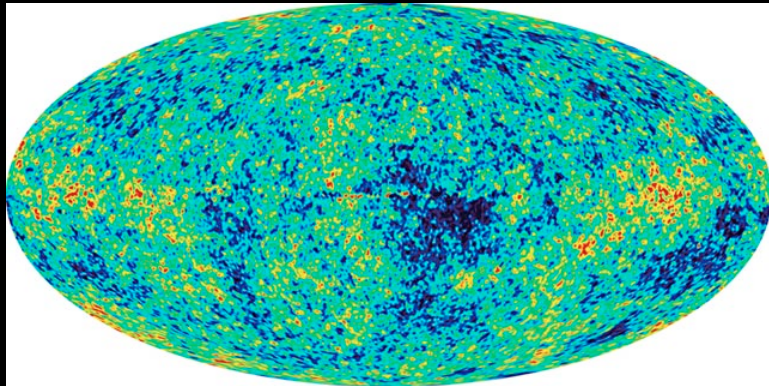
# The Universe -the ultimate particle accelerator!

When the universe was smaller, it was hotter and denser



# What's with the spots?

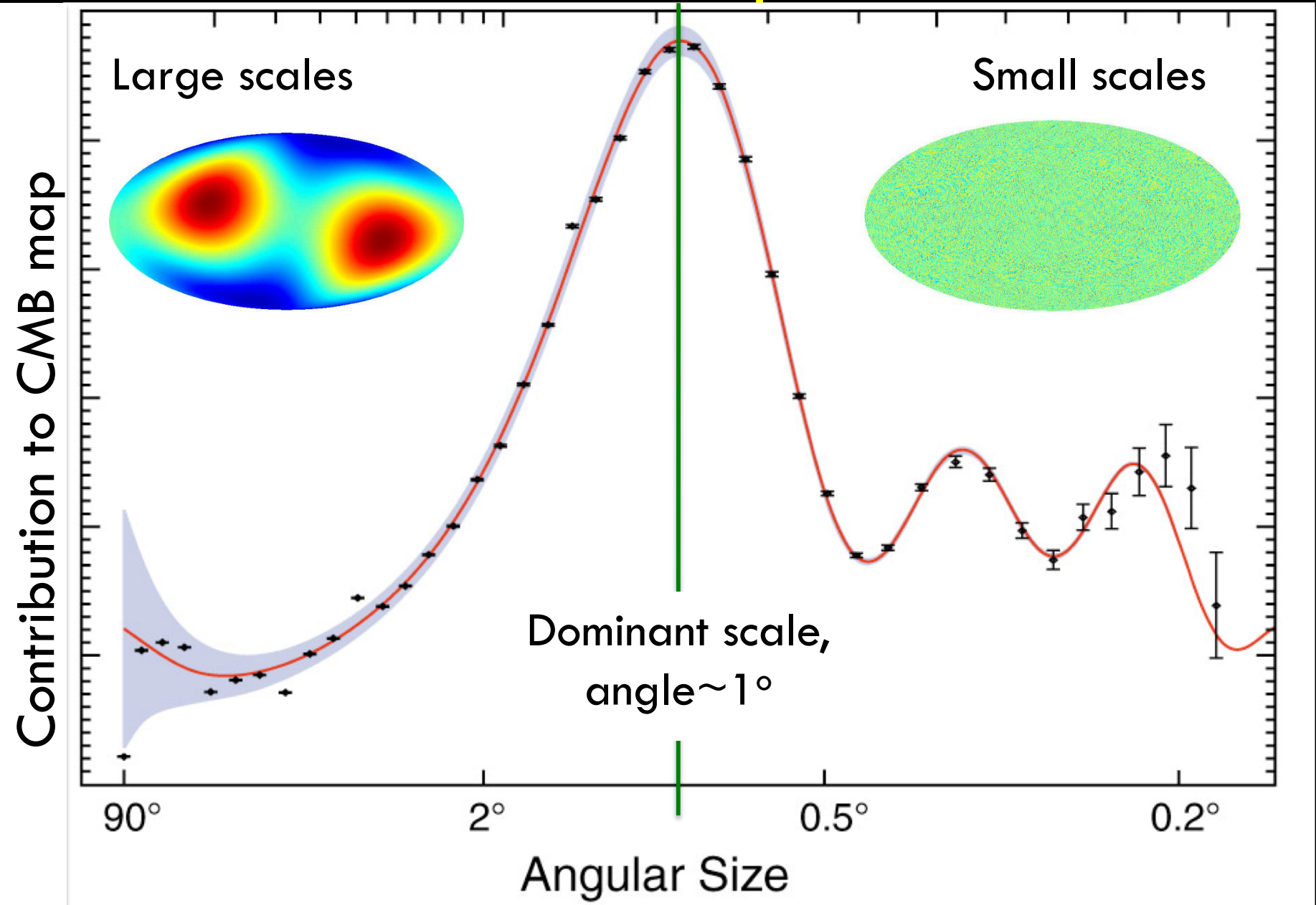
Is there a characteristic size of the temperature fluctuations?





# What's with the spots?

## CMB “Power Spectrum”

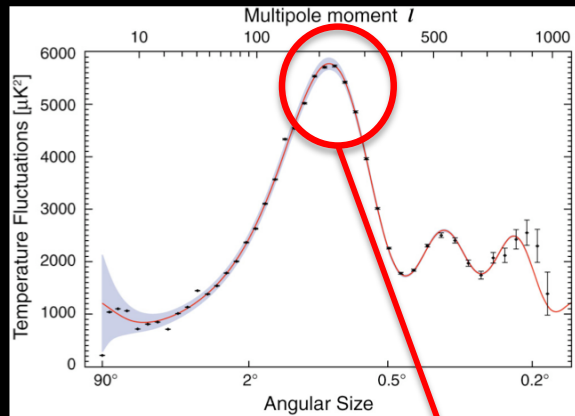




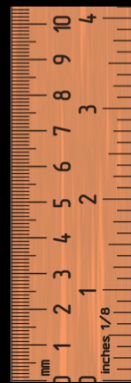
# What's with the spots?

## Characteristic size = Standard Ruler

- Yay! A distance (to when CMB was formed).



$L = 400,000$  lyrs



$$\theta = \frac{L}{D} \sim 1^\circ$$



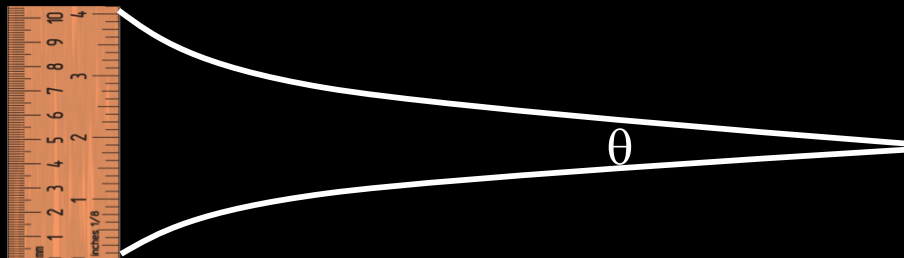
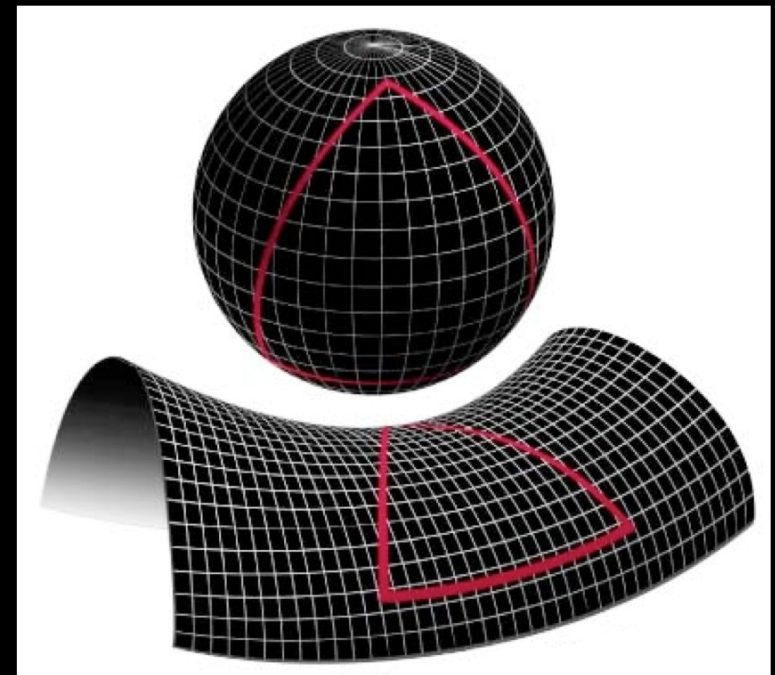
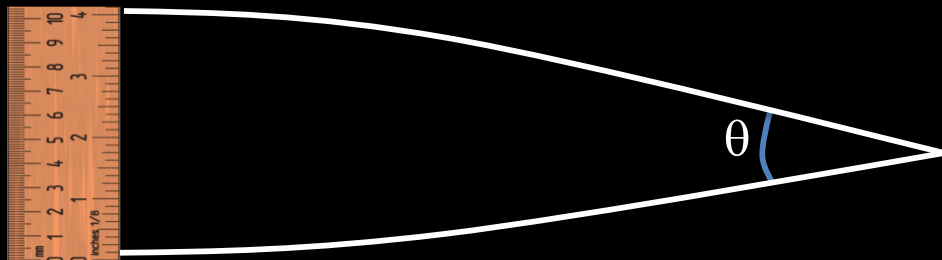
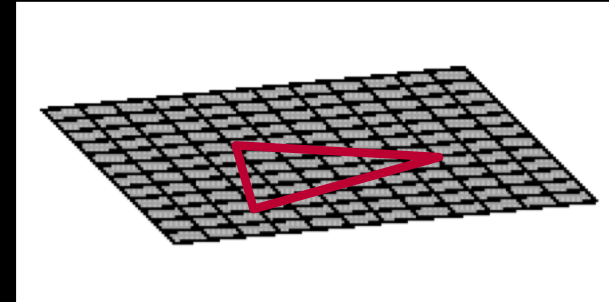
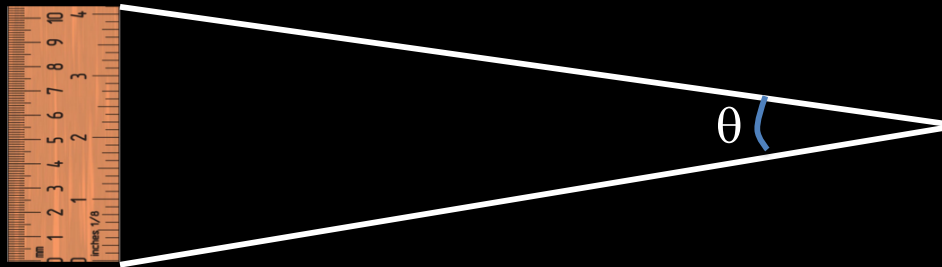
Distance,  $D$



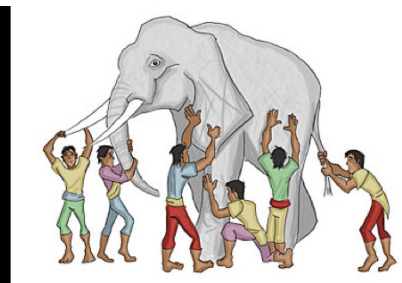
# What's with the spots?

## Tell us if space is curved

- CMB tells us universe is essentially flat



# Parting thoughts



- Astrophysical data providing insights into the laws of nature at scales and densities inaccessible on earth
- Creating profound challenges for our theoretical understanding.
- Upcoming surveys will provide massive data sets from which we want to extract miniscule signals from competing noise.
- They will play a revolutionary role in answering key outstanding questions about the cosmos.
- This an amazing time to work in astrophysics!