

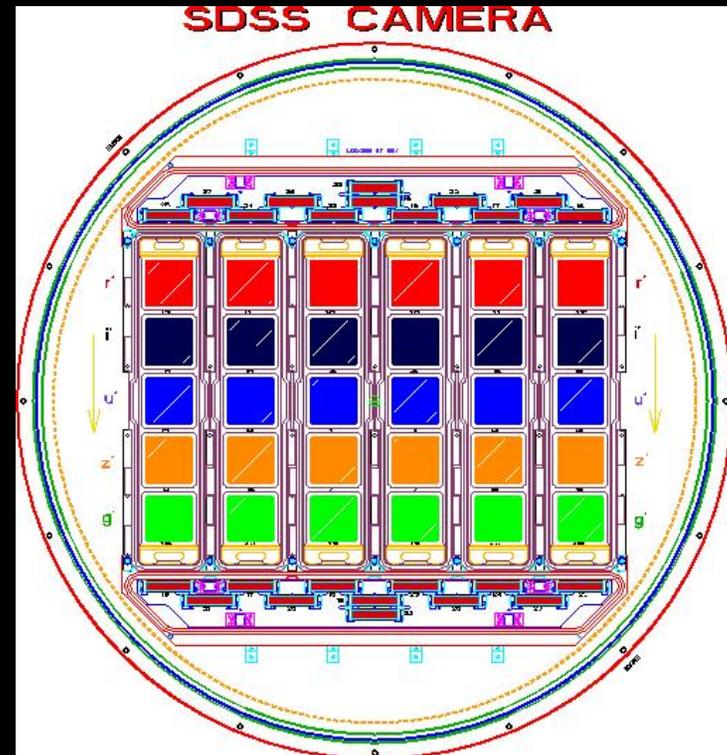
# Science from the LSST

Andrew Connolly

Department of Astronomy  
University of Washington



# Era of surveys: the Sloan Digital Sky Survey



- Digital sky survey with a 120 Megapix CCD camera
- Precise measurements for 470,000,000 objects (DR8)
- Revolution in astronomy: public databases

# The Decadal Survey (2010)

## Top rank accorded to LSST is a result of:

(1) “its compelling science case and capacity to address so many of the science goals of this survey”,

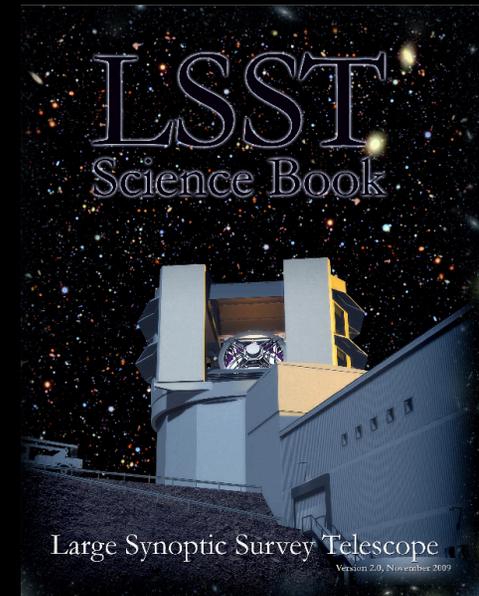
[and]

(2) “its readiness for submission to the MREFC process as informed by its technical maturity, the survey’s assessment of risk, and appraised construction and operations costs.”

## LSST Science Book

Summarizes the basic parameters of the LSST hardware, software, and observing plans, discusses educational and outreach opportunities, and describes a broad range of science that LSST will revolutionize

**245 authors, 15 chapters, 600 pages**



# Outline

## **1. LSST system summary**

Science Themes

System Characteristics

## **2. LSST science examples**

Extragalactic astronomy and cosmology

The Milky Way and the Local Group

Time Domain

## **3. Science in the era of big data**

Scaling the analysis and tools

# LSST science themes

**1. Dark matter, dark energy, cosmology**

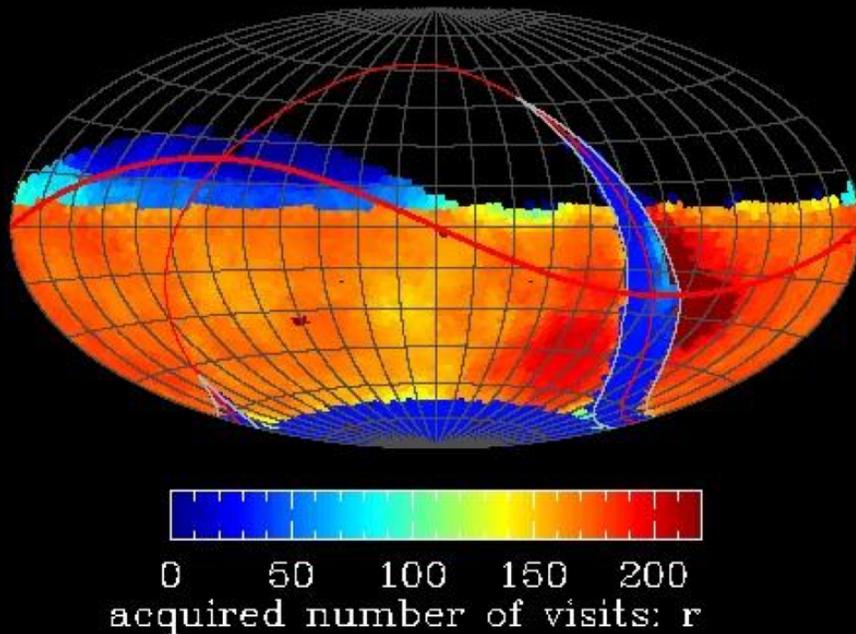
**2. Time domain**

**3. The Solar System structure**

**4. The Milky Way structure**

These drivers not only require similar hardware and software systems, but also motivate a uniform cadence

# Basic idea behind LSST: a uniform survey



## LSST in one sentence:

An optical/near-IR survey of half the sky in ugrizy bands to  $r \sim 27.5$  (36 nJy) based on 1000 visits over 10-year period: **deep wide fast**.

- **90% of time will be spent on a uniform survey:** every 3-4 nights, observable sky is scanned twice per night
- **after 10 years, half of the sky imaged about 1000 times (in 6 bandpasses, ugrizy):** a digital color movie of the sky
- **~100 PB of data:** about a billion 16 Mpix images, enabling measurements for 20 billion objects

# Required system characteristics

**Large primary mirror** (at least 6m) to go faint and to enable short exposures (30 s)

**Agile telescope** (5 sec for slew and settle)

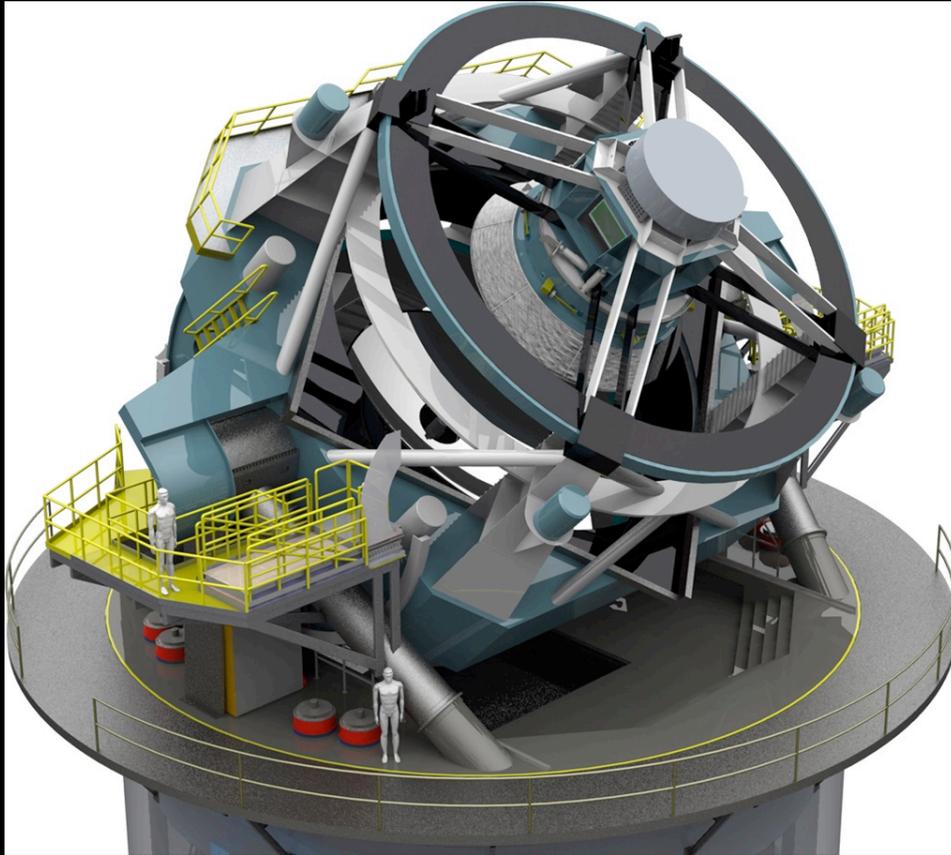
**Large field of view** to enable fast surveying

**Impeccable image quality** (weak lensing)

**Camera with 3200 Mpix**

**Sophisticated software** (20,000 GB/night, 20 billion objects, 20 trillion measurements)

# LSST telescope

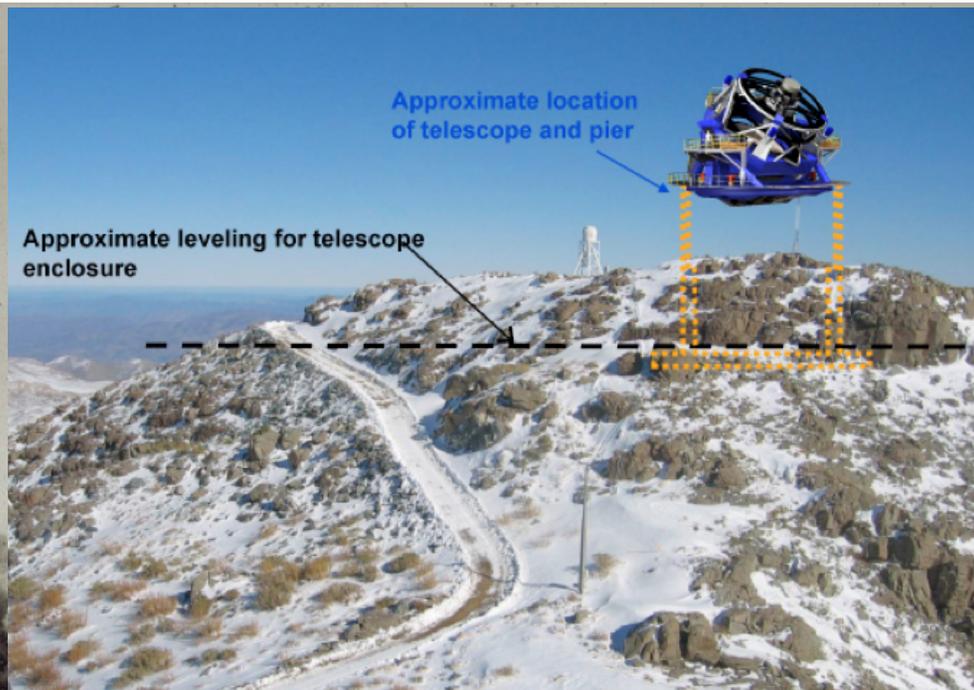


8.4m, 6.7m effective

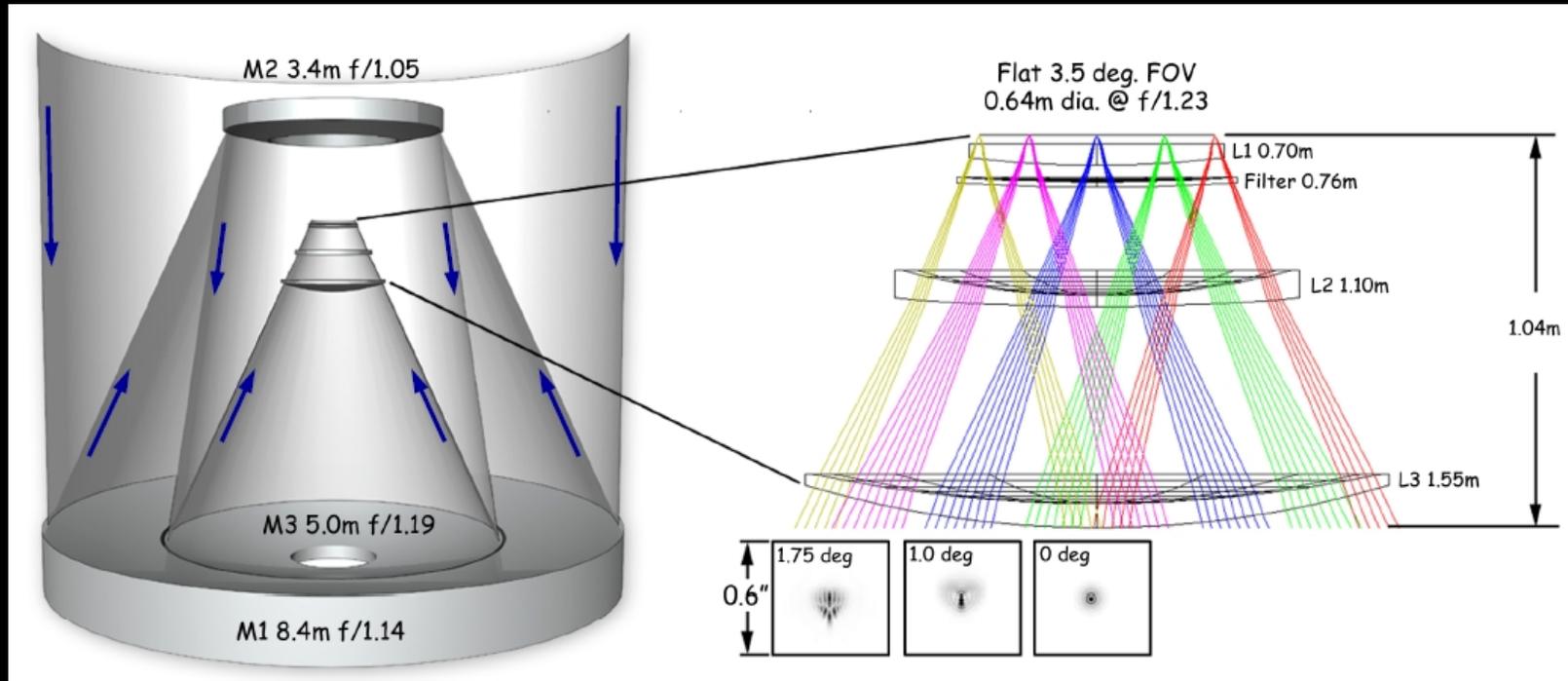
3.5° field-of-view

5 sec slew & settle

April 12,  
2011



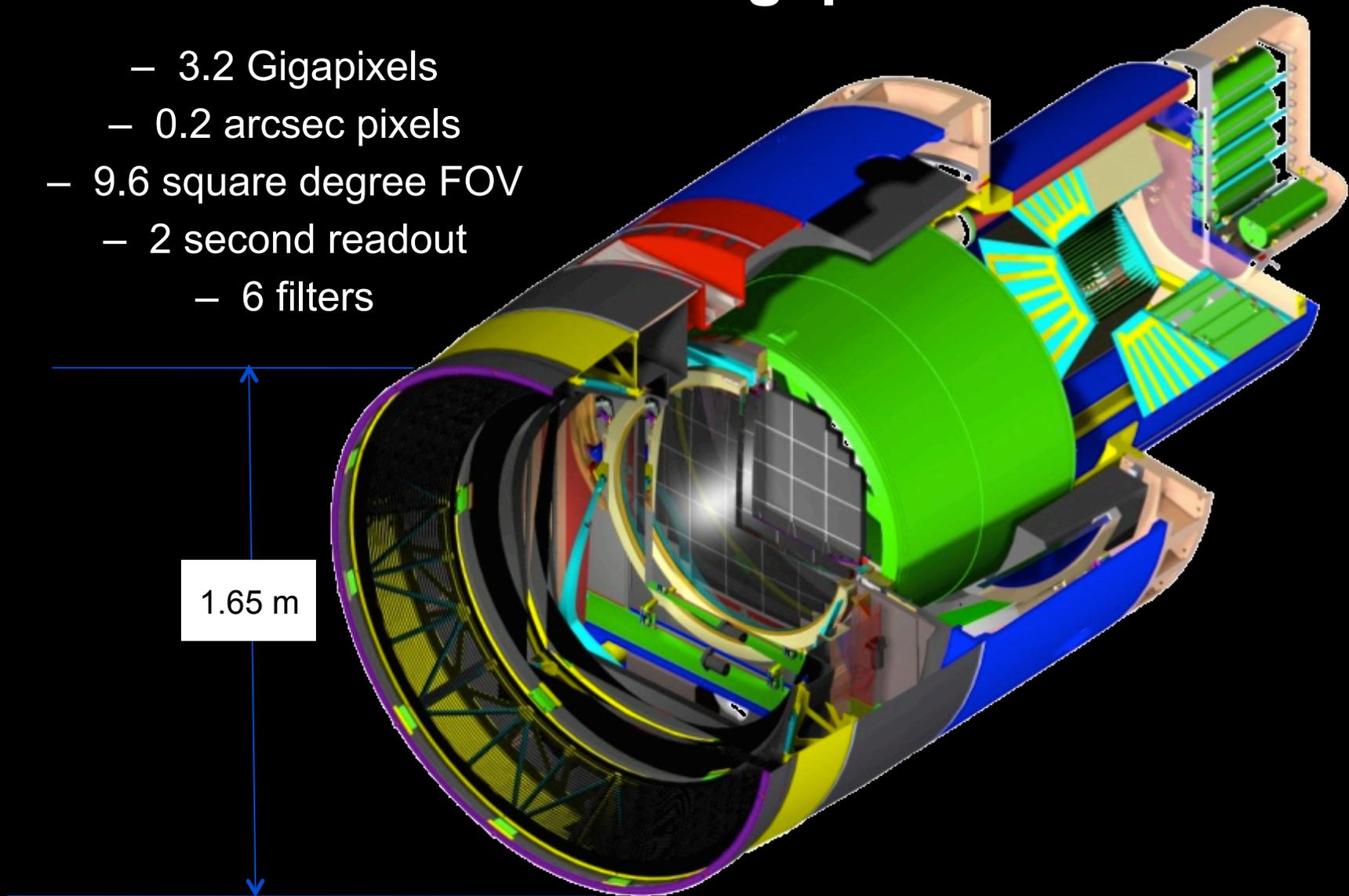
# Optical design for LSST



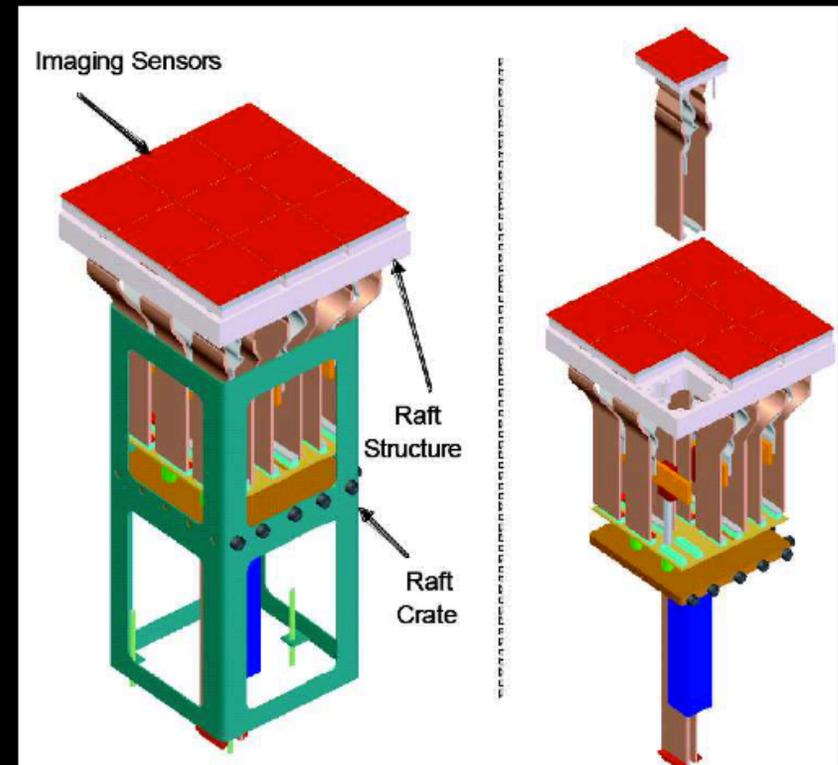
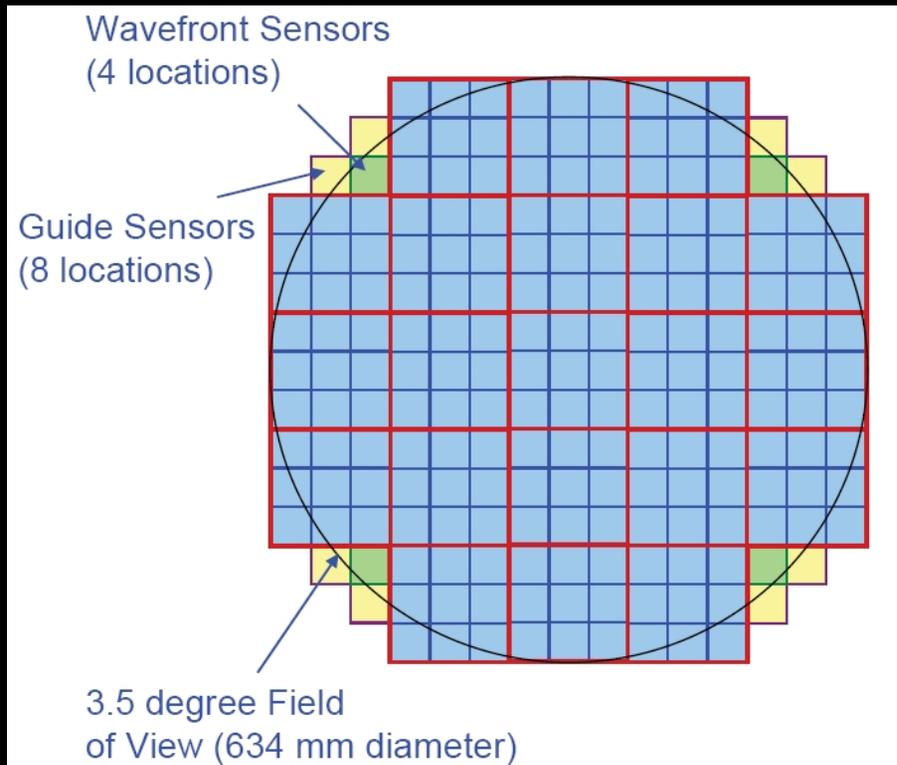
Three-mirror design (modified Paul-Baker system) enables large field of view with excellent image quality: delivered image quality is dominated by atmospheric seeing

# LSST camera: A 3.2 Gigapixel camera

- 3.2 Gigapixels
- 0.2 arcsec pixels
- 9.6 square degree FOV
- 2 second readout
- 6 filters



# LSST camera: A 3.2 Gigapixel camera

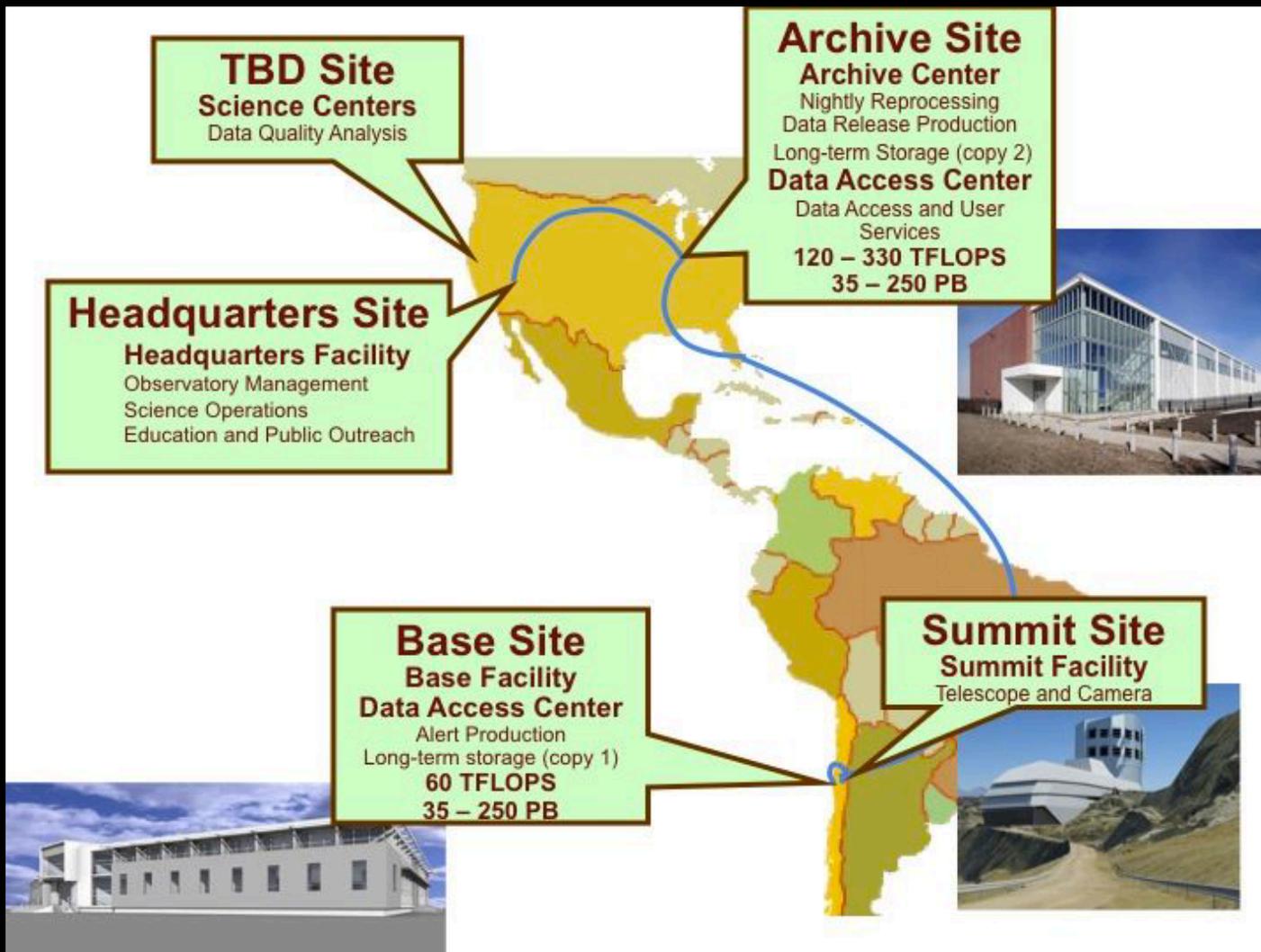


Modular design: 3200 Megapix = 189 x 16 Megapix CCD  
9 CCDs share electronics: raft (=camera)  
Problematic rafts can be replaced relatively easily

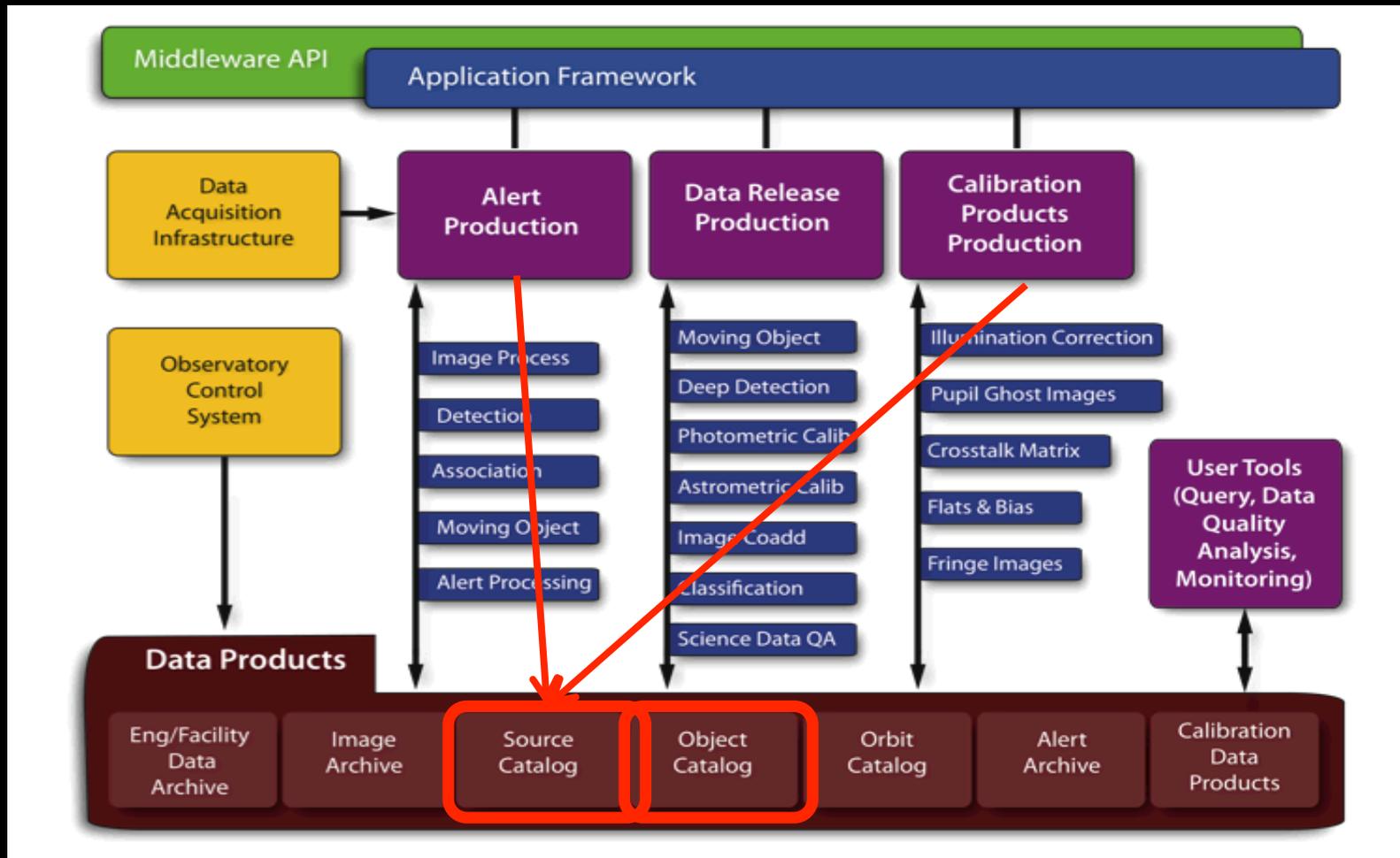
# Processing the data flow from the LSST

- **Each “Visit” comprises a pair of back-to-back exposures**
  - 2x15 sec exposure; duration = 34 seconds with readout
- **The data volume associated with this cadence is unprecedented**
  - one 6.4-gigabyte image every 17 seconds
  - 15 terabytes of raw scientific image data / night
  - 100-petabyte final image data archive
  - 20-petabyte final database catalog
  - 2 million real time events per night every night for 10 years

# Processing the data flow from the LSST



# LSST data processing pipelines are being designed prototyped and tested



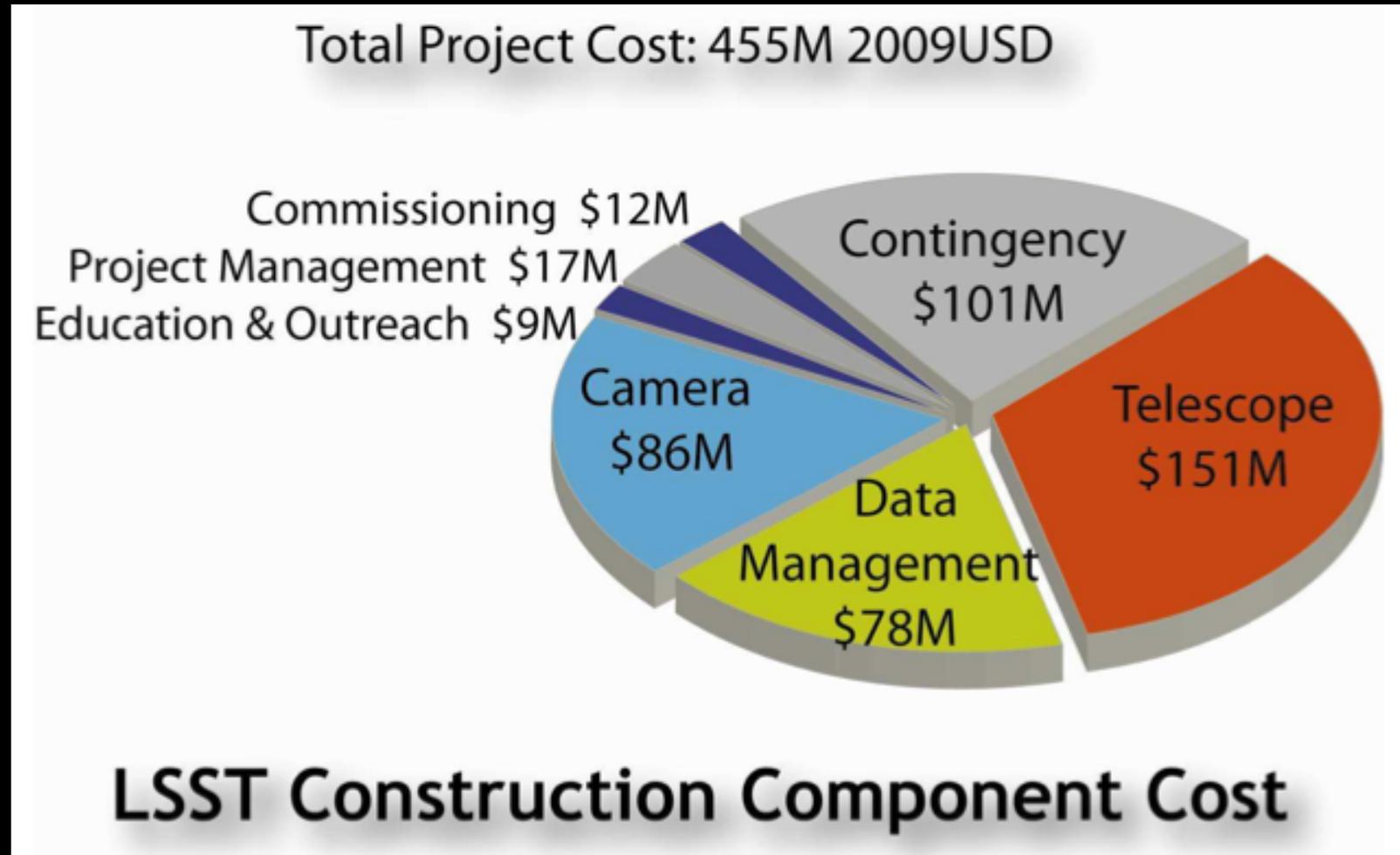
# LSST timeline



- **Estimate: commissioning in late 2020 (if MREFC in FY2014)**
  - Primary/Tertiary Mirror being polished, have secondary mirror blank
  - Sensor development program delivered first prototype sensors
  - Processing pipelines under construction, hand-in-hand with simulations of Operations, Images, Catalogs
- **Cost: about the same as CATE estimate**  
(~\$850M in \$2011, contributions from NSF, DOE and private gifts)

# Budgeting of the LSST

Half for construction, half for 10 years of operations



First light: around 2020 (if federal constr. in FY2014)

# Outline

## **1. LSST system summary**

Science Themes

System Characteristics

## **2. LSST science examples**

Extragalactic astronomy and cosmology

The Milky Way and the Local Group

Time Domain

## **3. Science in the era of big data**

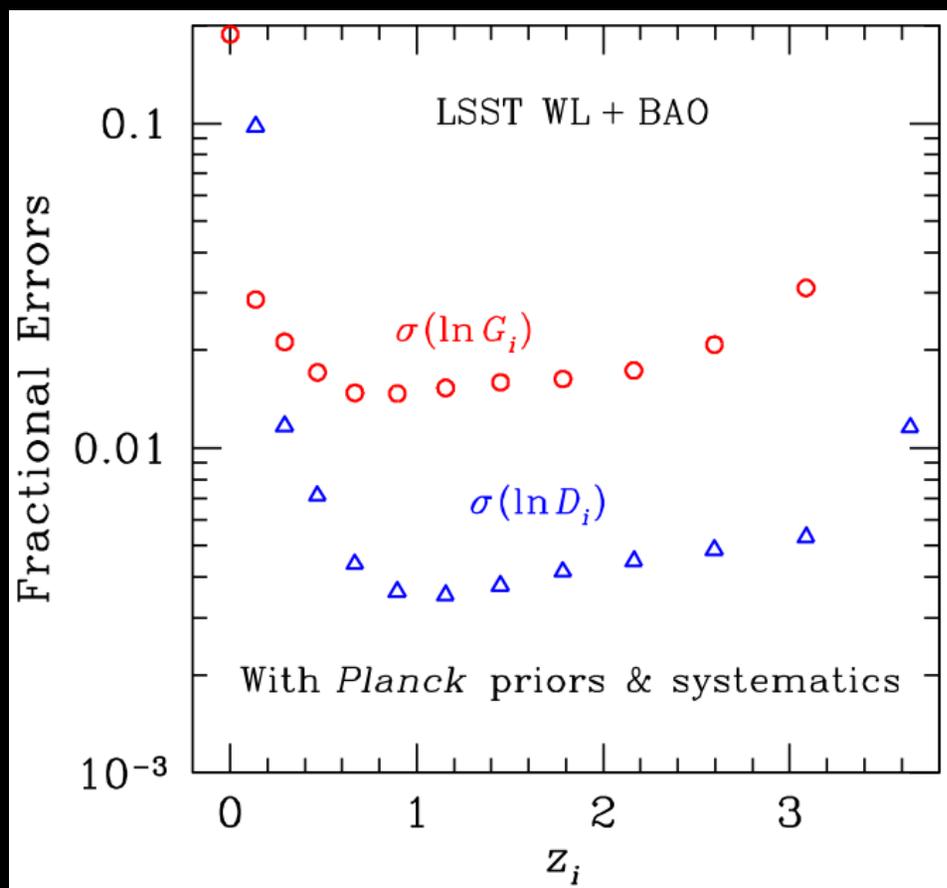
Scaling the analysis and tools

# Modern cosmological probes

- **Cosmic Microwave Background**
  - the state of the Universe at the recombination epoch, at redshift  $\sim 1100$ )
- **Weak Lensing**
  - growth of structure
- **Galaxy Clustering**
  - growth of structure
- **Baryon Acoustic Oscillations**
  - standard ruler
- **Supernovae**
  - standard candle

Except for CMB, measuring  $H(z)$  and growth of structure  $g(z)$

# Cosmology with LSST

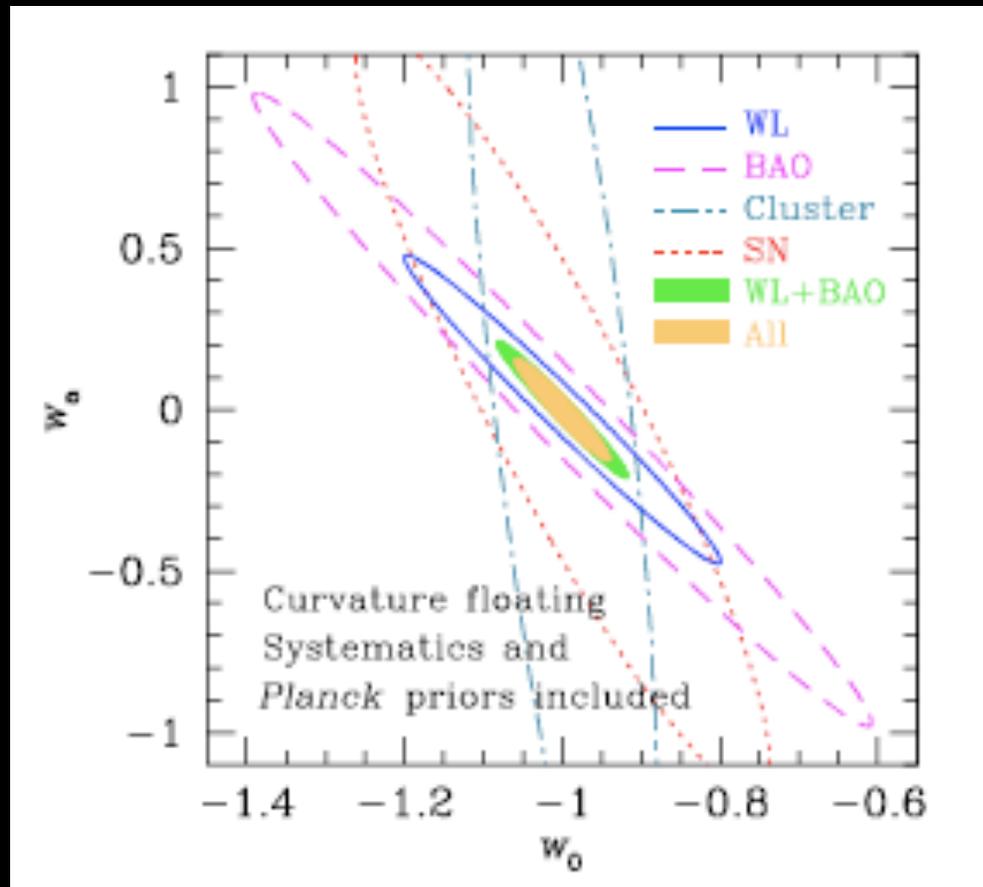


Derived from 4 billion galaxies ( $i < 25.3$ ,  $\text{SNR} > 20$ ) with accurate photo- $z$  and shape measurements

Measuring distances and growth of structure with 1% accuracy for  $0.5 < z < 3$

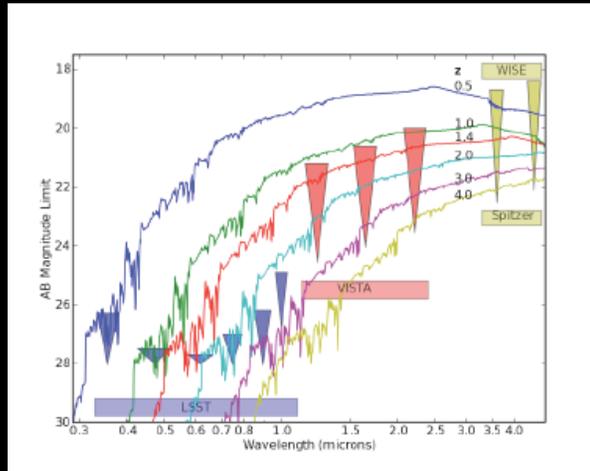
SNe will provide a high angular resolution probe of homogeneity and isotropy of the Universe

# Separate and joint constraints on the dark energy equation of state

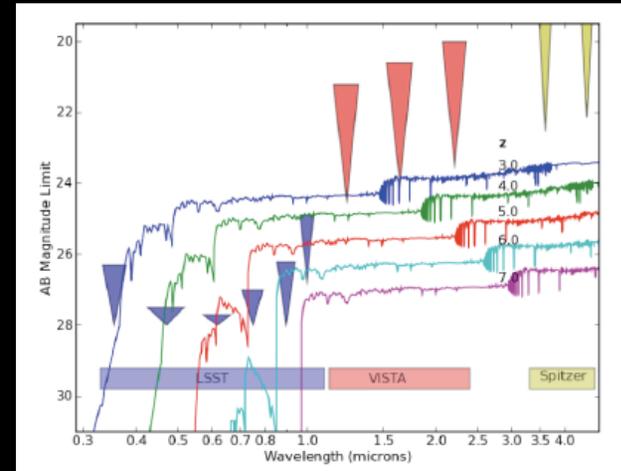


$$w(a) = w_0 + w_a(1+a)$$

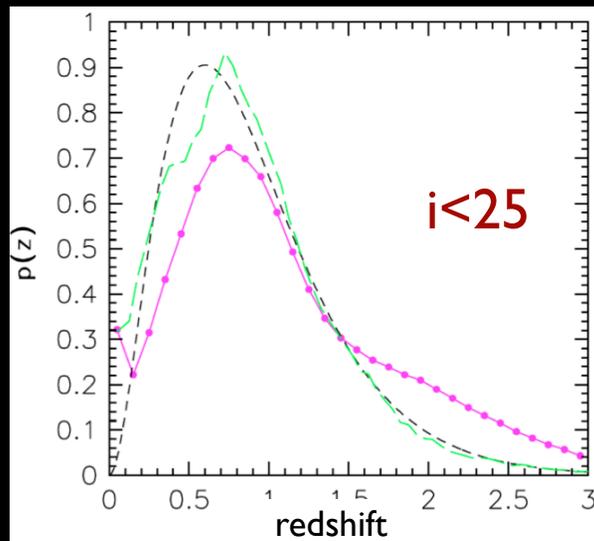
# Extragalactic astronomy: galaxies



Fiducial Red Sequence Galaxy

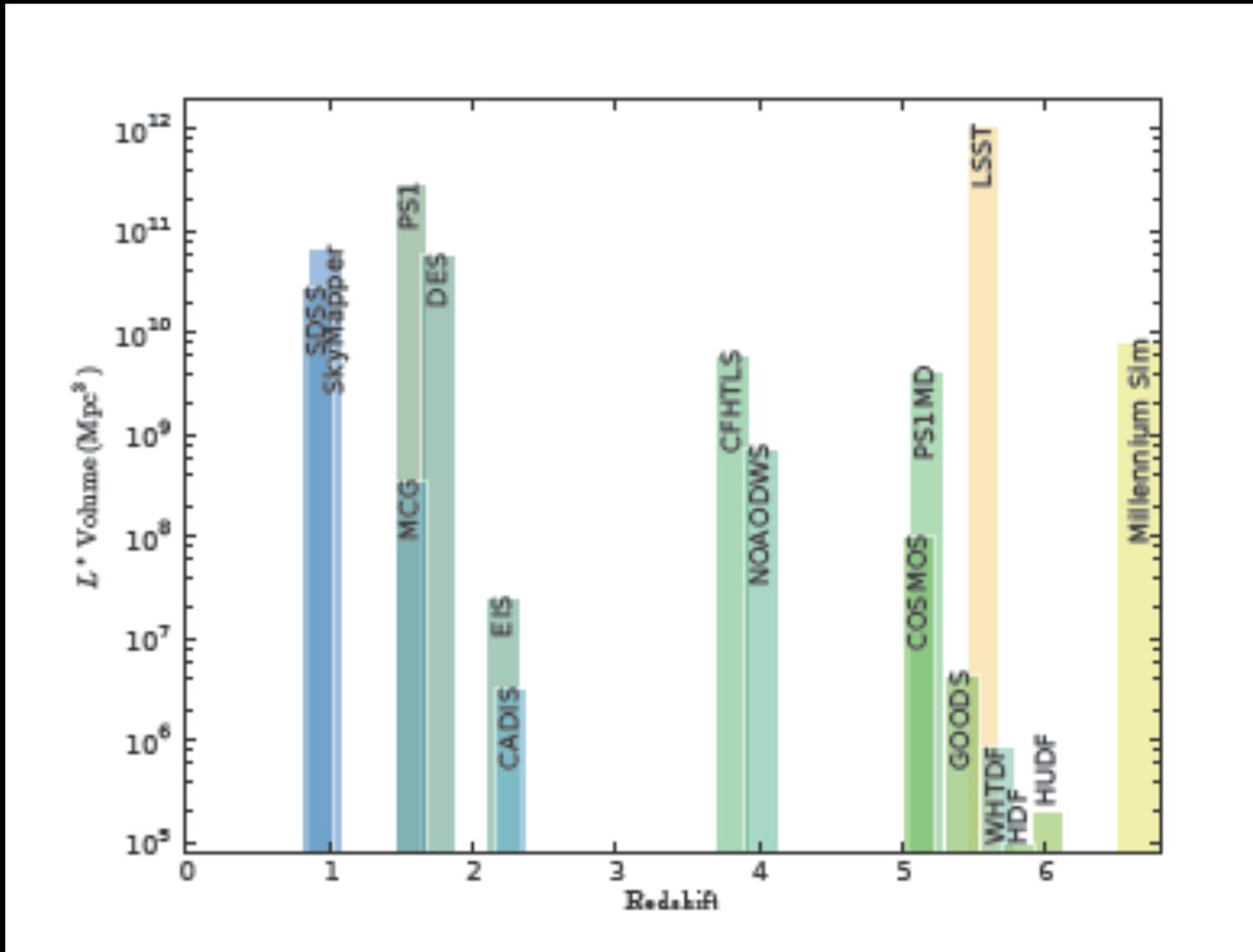


Fiducial Lyman-Break Galaxy



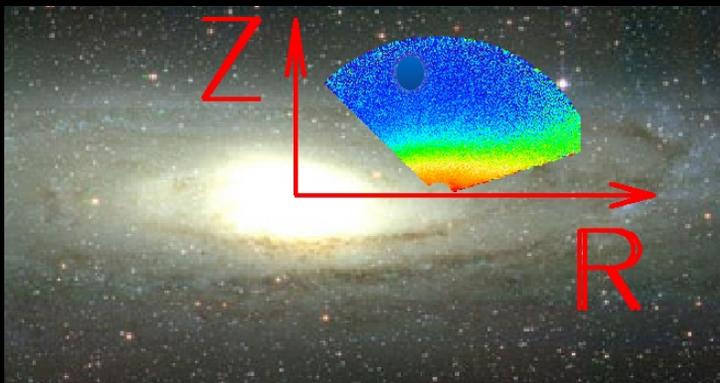
- About 10 billion galaxies, with 4 billion in a “gold” sample defined by  $i < 25.3$
- The “gold” sample extends to redshifts of  $> 2.5$ : evolution

# LSST's effective volume

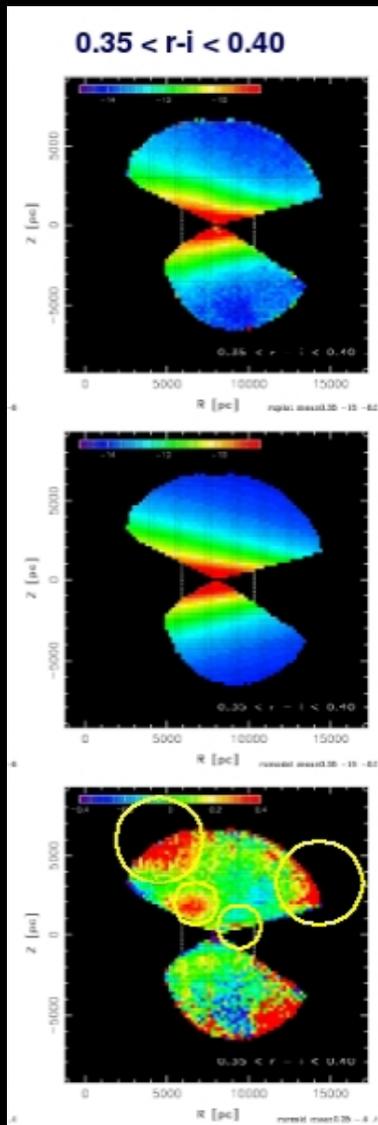
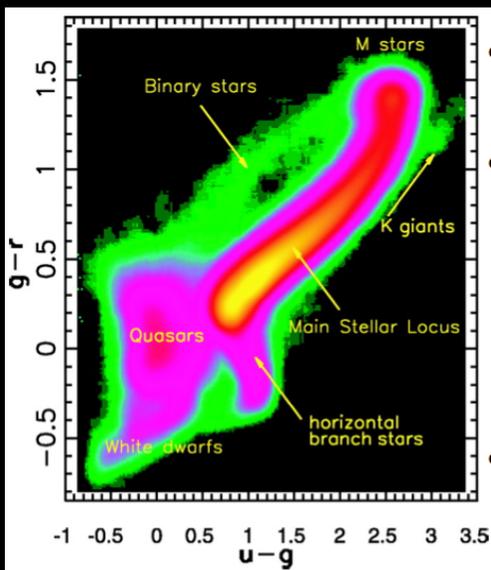


# The Milky Way structure: 10 billion stars

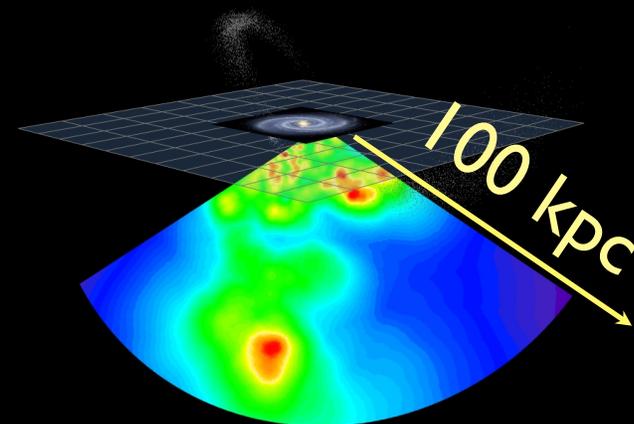
Main sequence stars



Distance and [Fe/H]:



Compared to SDSS:  
LSST can “see” 10  
times further away  
and over twice as  
large an area



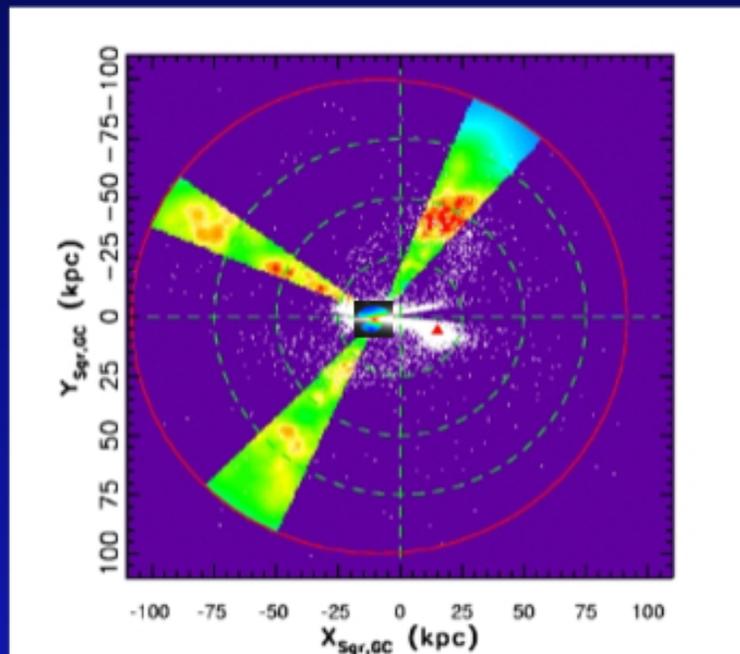
Sesar et al. (2009)

SDSS RR Lyrae

The large blue circle: the  $\sim 400$  kpc limit of future LSST studies based on RR Lyrae

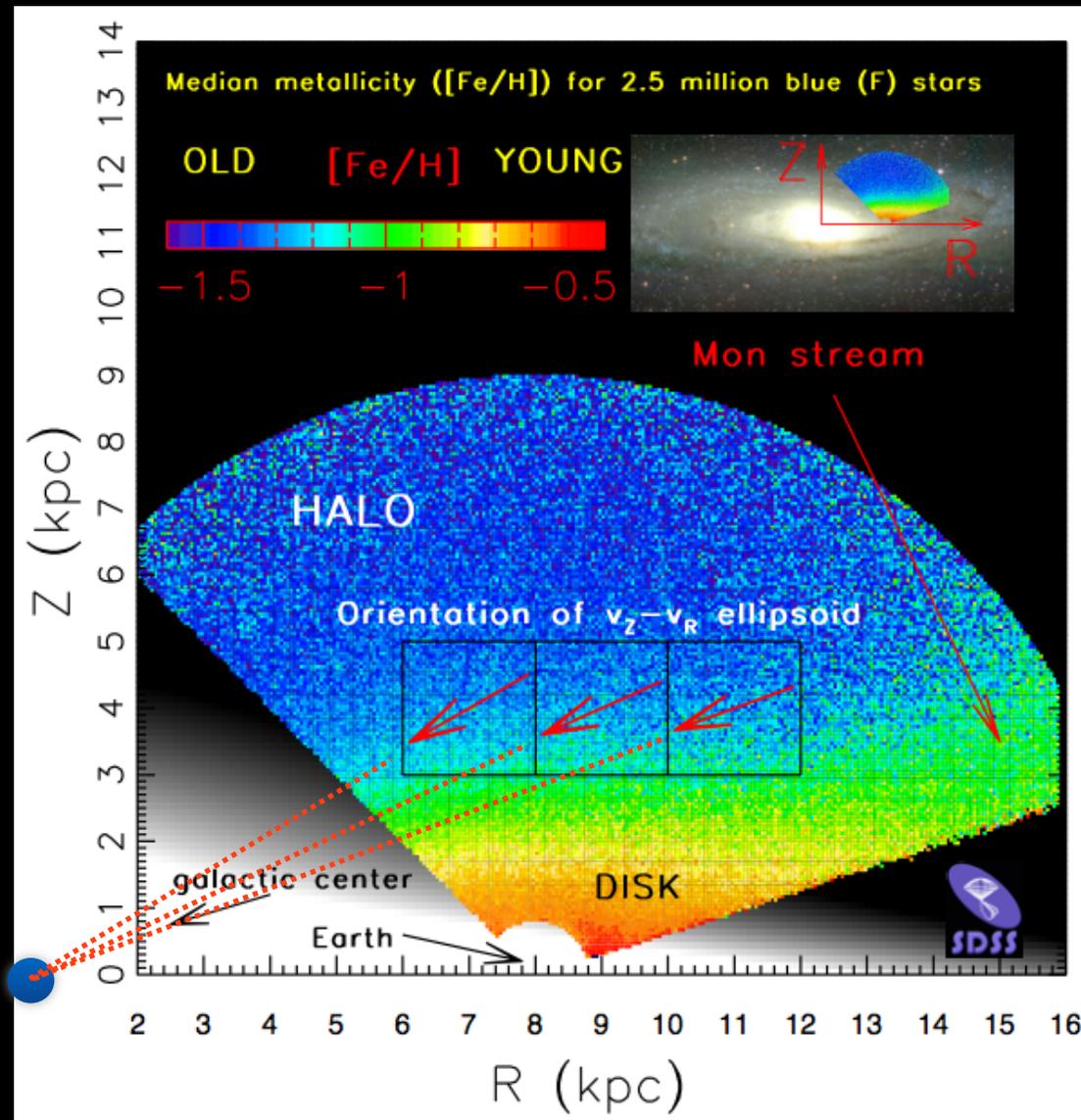
The large red circle: the  $\sim 100$  kpc limit of future LSST studies based on main-sequence stars (and the current limit for RR Lyrae studies)

LSST limit for RR Lyrae: 400 kpc



The small insert:  
 $\sim 10$  kpc limit of SDSS and future Gaia studies for kinematic &  $[Fe/H]$  mapping with MS stars

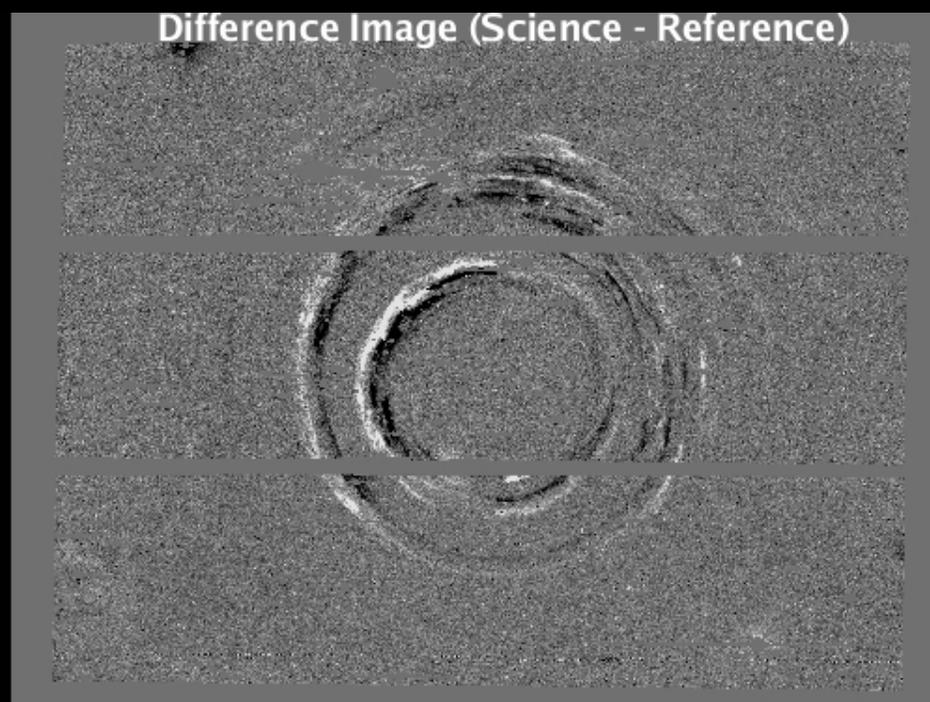
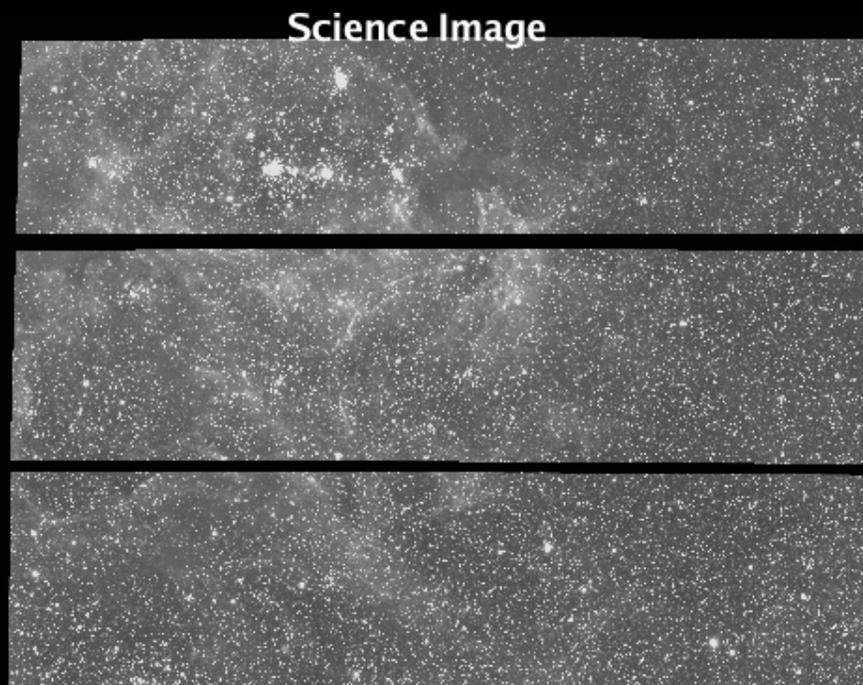
# Extending the time domain: proper motions



Kinematics of halo stars based on SDSS-POSS proper motions: velocity ellipsoid is nearly invariant in spherical coordinate system, which implies that the gravitational potential must be nearly spherical!

# Extending the time domain: variability

Not only point sources - echo of a supernova explosion:



**Becker et al.**

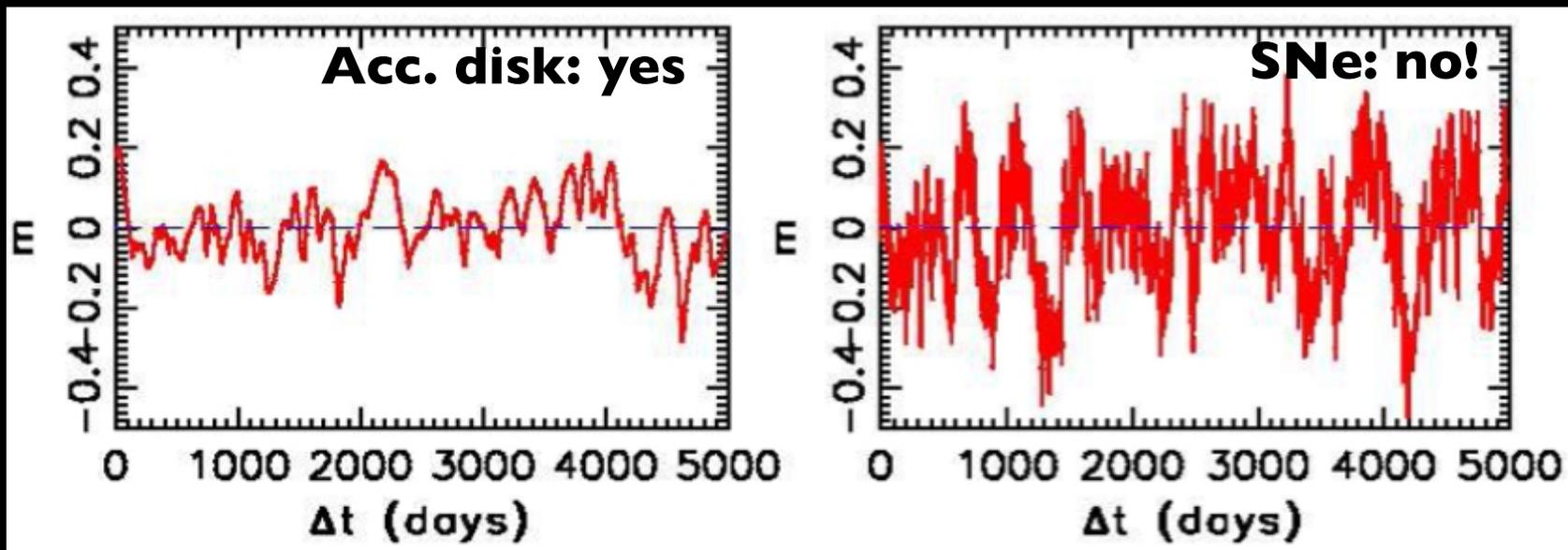
As many variable stars from LSST, as all stars from SDSS  
**stream with data for transients within 60 seconds**

# Extending the time domain: quasar variability

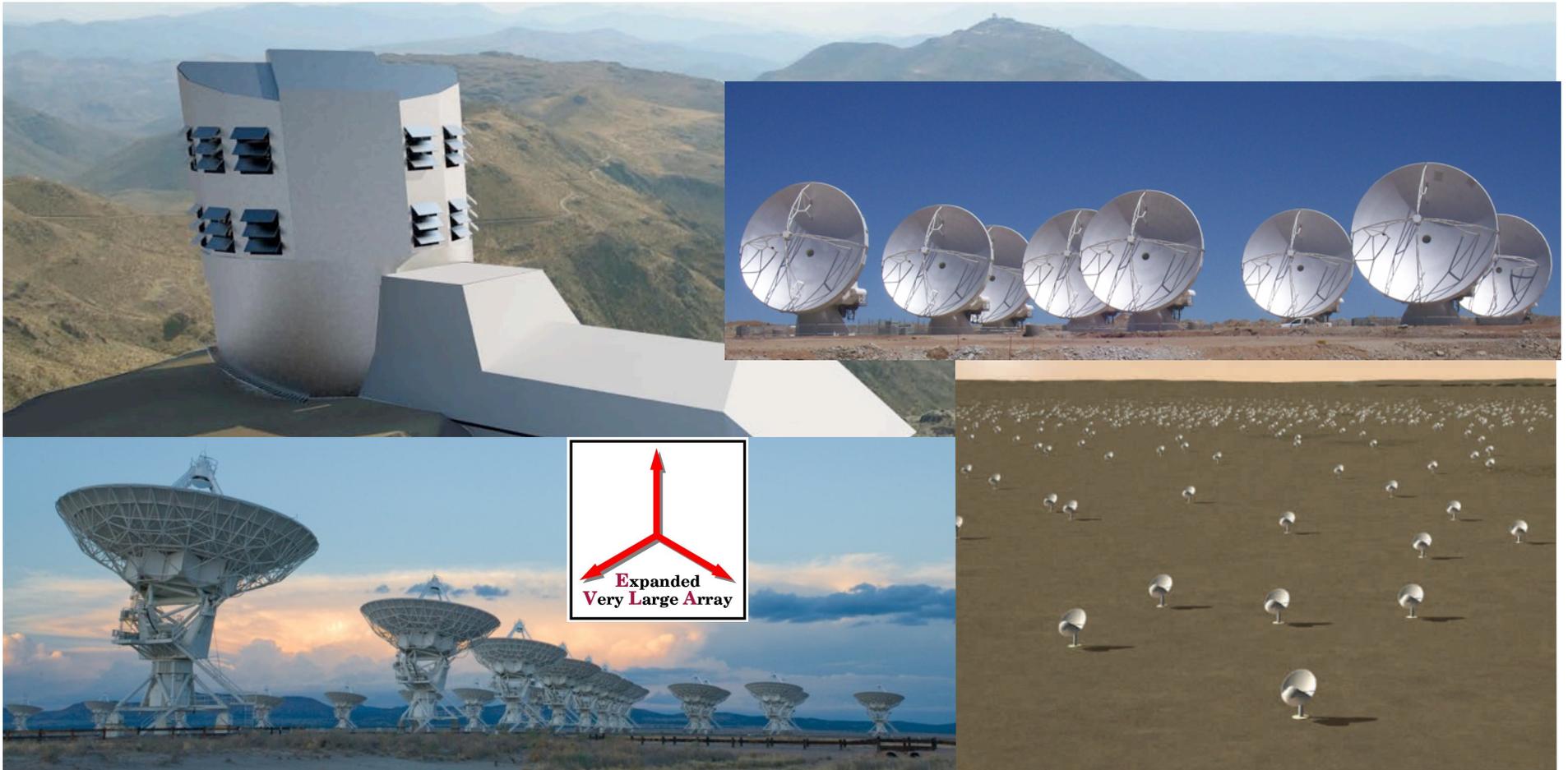
Competing theories for the origin of variability:

Microlensing - Bursts of Supernovae - Accretion disk instabilities

SDSS Stripe 82 observations indicate rich information content and can already reject some models (MacLeod et al. 2010):



Variability is a tool, just like imaging, spectroscopy and multi-wavelength X-ray to radio observations, for studying quasars



## The impact of LSST on other wavelengths, and vice versa:

- 1) Science Results (e.g. galaxy/AGN evolution)
  - 2) Tools and Methods (e.g. massive databases [radio])
  - 3) Supplemental data (coeval, identification, physical processes)
- Also non-EM: e.g. Advanced LIGO

# Outline

## **1. LSST system summary**

Science Themes

System Characteristics

## **2. LSST science examples**

Extragalactic astronomy and cosmology

The Milky Way and the Local Group

Time Domain

## **3. Science in the era of big data**

Scaling the analysis and tools

# Statistics, Data Mining and Machine Learning in Astronomy

Zeljko Ivezic, Andrew Connolly,  
Jacob Vanderplas, Alex Gray

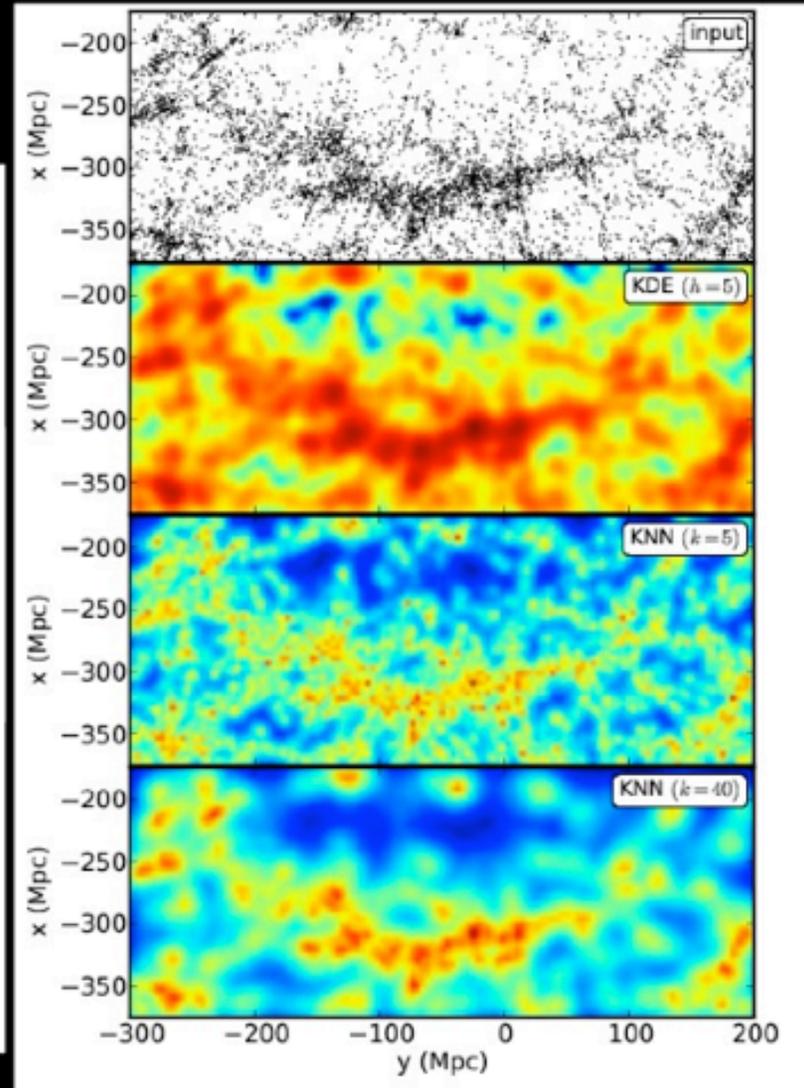
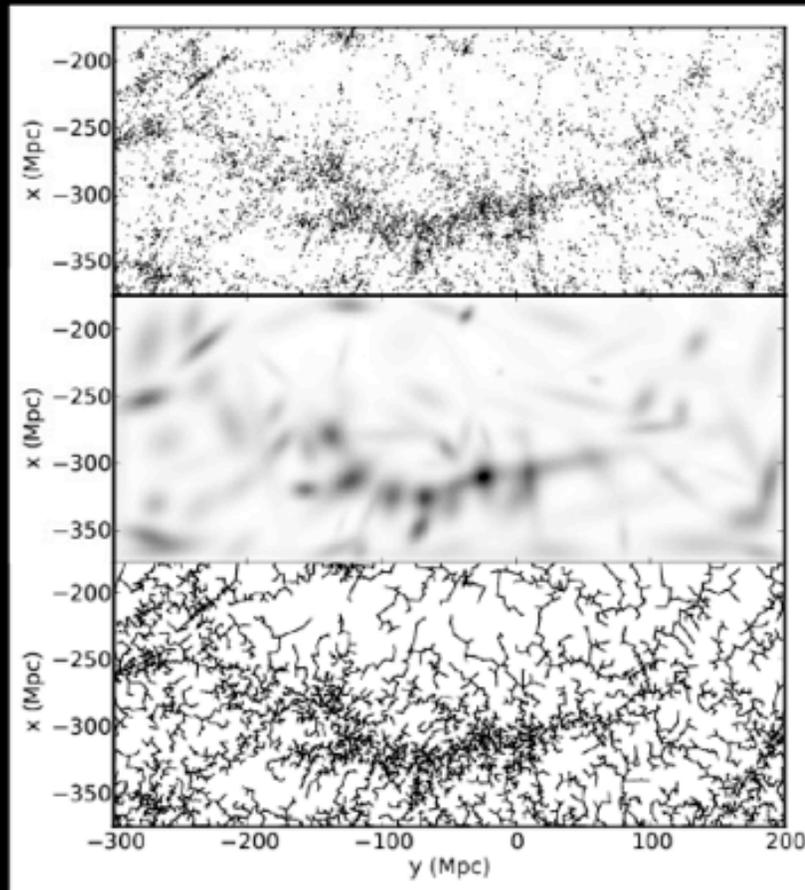
Princeton University Press, 2013



- Complete *Practical* guide to statistical analysis, data exploration, and machine learning
- Example-driven approach, using real data (SDSS, LIGO, LINEAR, WMAP, and others)
- All book figures and examples generated in python (matplotlib), with code available online – for free!
- Makes use of *numpy*, *scipy*, *matplotlib*, *scikit-learn*, *pymc*, *healpy*, and others
- Supporting python package: *astroML*

**New book!**

# Clustering and Density Estimation: SDSS Great Wall



**One of >100 examples**



## LSST in one sentence:

An optical/near-IR survey of half the sky in ugrizy bands to  $r \sim 27.5$  based on 1000 visits over a 10-year period:

a catalog of 10 billion stars and 10 billion galaxies with exquisite photometry, astrometry and image quality.

**More information**  
at [www.lsst.org](http://www.lsst.org)  
**arXiv:0805.2366**