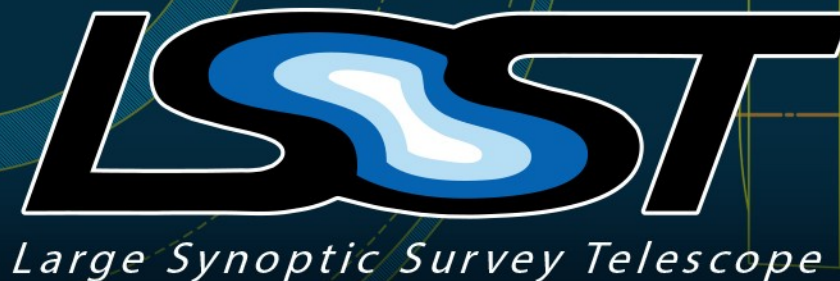




Galaxy modelling for all-sky multiwavelength surveys

Dan Taranu & LSST Data Management



Large Synoptic Survey Telescope *LSST*



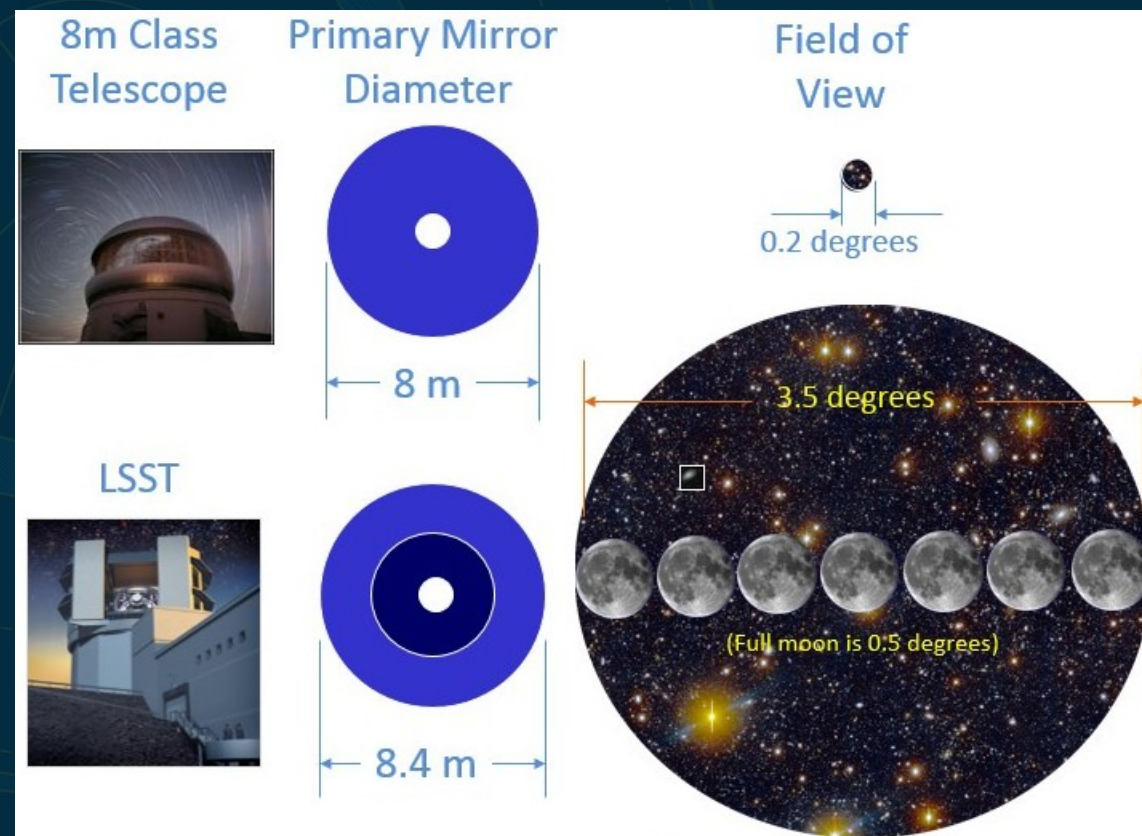
Photo: Gianluca Lombardi

Large Synoptic Survey Telescope

lsst.org/scientists/keynumbers

lsst.org/science

lsst.org/participate



Large Synoptic Survey Telescope

lsst.org/scientists/keynumbers

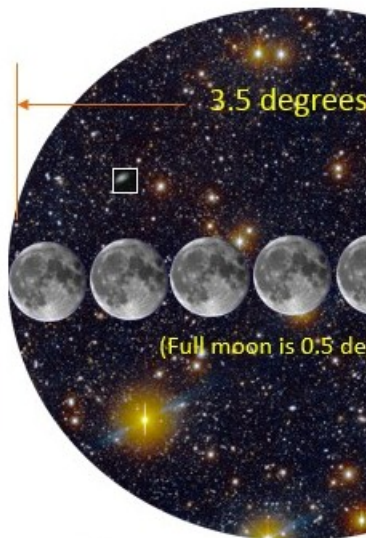
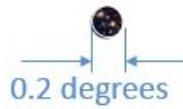
lsst.org/science

lsst.org/participate

8m Class
Telescope

Primary Mirror
Diameter

Field of
View



LSST



Optical System:

Etendue ($A\Omega$) = 319 meter²degrees²
 Field of View = 3.5 degrees (9.6 square degrees)
 Primary mirror diameter = 8.4 m
 Effective clear aperture = 6.68 m (on-axis)
 Mean effective aperture = 6.423 m (area weighted over FOV)
 Final f-ratio = $f/1.234$
 Plate scale = 50.9 microns/arcsec

Imaging System:

Pixel count = 3.2 Gpixels
 Readout time = 2 sec
 Dynamic range = 18 bits
 Pixel pitch = 10 micron (0.2 arcsec)

Spectral Response:

Full bandpass range = 320-1050 nm
 Total number of filters = 6
 Number of active filters = 5
 System 50% response points (nm)
 u 324 395
 g 405 552
 r 552 691
 i 691 818
 z 818 921
 y 922 997

Survey Area:

Fiducial main survey area = 18,000 deg²
 Total covered area (est.) = 25,000 deg²
 (main survey + special programs)
 Fiducial number of visits per pointing in the main survey = 825

Network bandwidths:

Summit (Pachón) to Base (La Serena) = 600 Gbps
 Base (La Serena) to Archive (NCSA) = 2 x 100 Gbps

Observation Properties:

The standard visit = 2 x 15 sec. exposures
 Exposure sequence = 1 s open shutter + 14 s dwell + 1 s close shutter = 16 s
 Visit sequence = 16 s exp + 2 s readout + 16 sec exp = 34 s (second readout concurrent with slew)
 Median slew time between visits = 4.8 s
 Mean slew time between visits = 6.8 s
 Visits per night = "about a 1000"
 Calibration exposures = 450/day
 Data collected per 24 hr period = "about 20 TB"

Data Releases:

Number of Data Releases = 11
 Date of DR1 release = Date of Operations Start+ 12 months
 Estimated numbers for DR-1 release
 Objects = 18 billion
 Sources = 350 billion (single epoch)
 Forced Sources = 0.75 trillion
 Estimated numbers for DR-11
 Objects = 37 billion
 Sources = 7 trillion (single epoch)
 Forced Sources = 30 trillion
 Visits observed = 2.75 million
 Images collected = 5.5 million

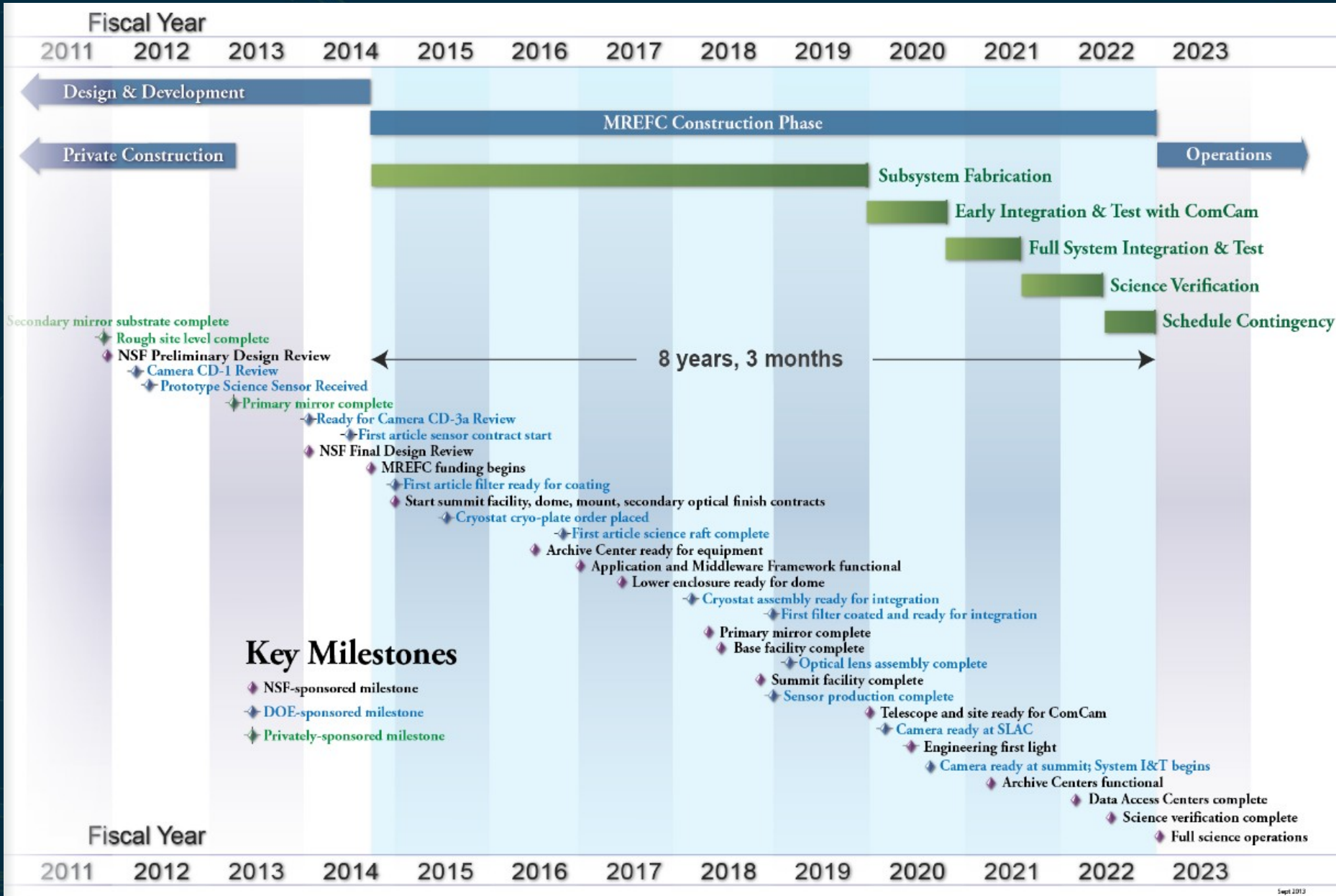
Alert Production:

Real-time alert latency = 60 seconds
 Average number of alerts per night = "about 10 million"

Data and compute sizes:

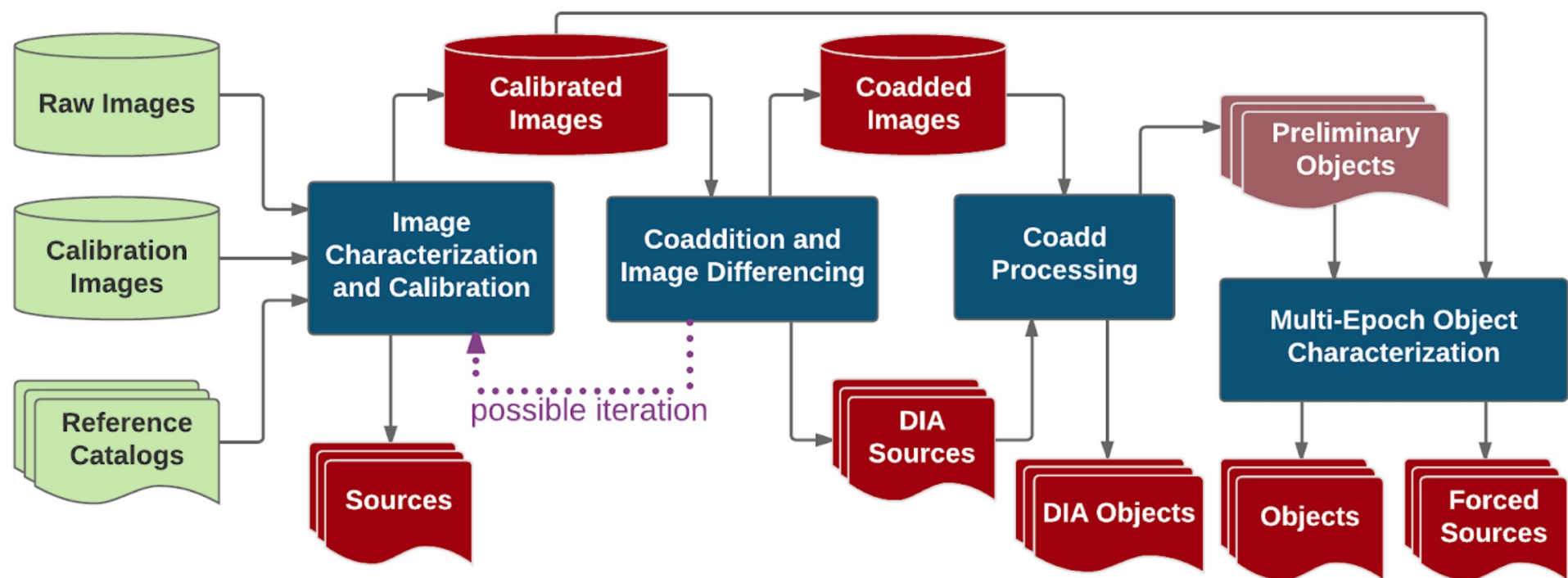
Final image collection (DR11) = 0.5 Exabytes
 Final catalog size (DR11) = 15 PB
 Final disk storage = 0.4 Exabytes
 Peak number of nodes = 1750 nodes
 Peak compute power in LSST data centers = 1.8 PFLOPS

Construction On Track



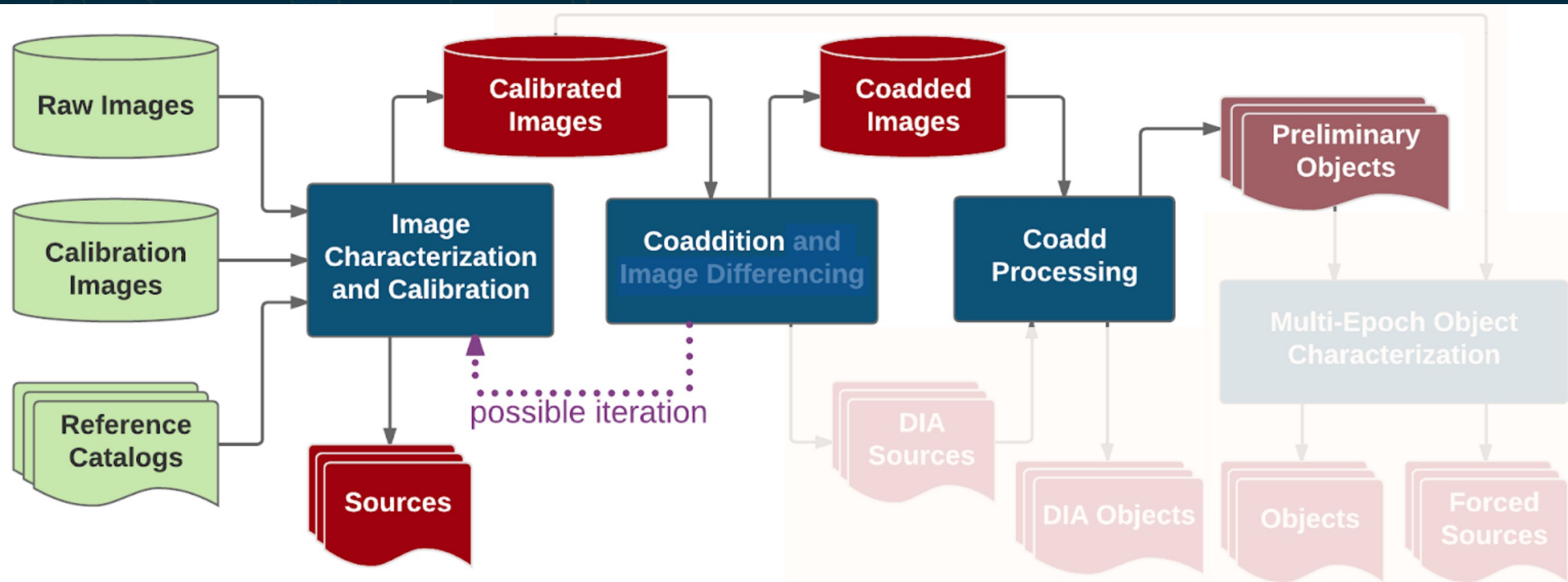
Science Pipelines Plan

- Data Management: dm.lsst.org
- Data Release Production – annual re-processing
- Current official plan – multi-epoch source modelling



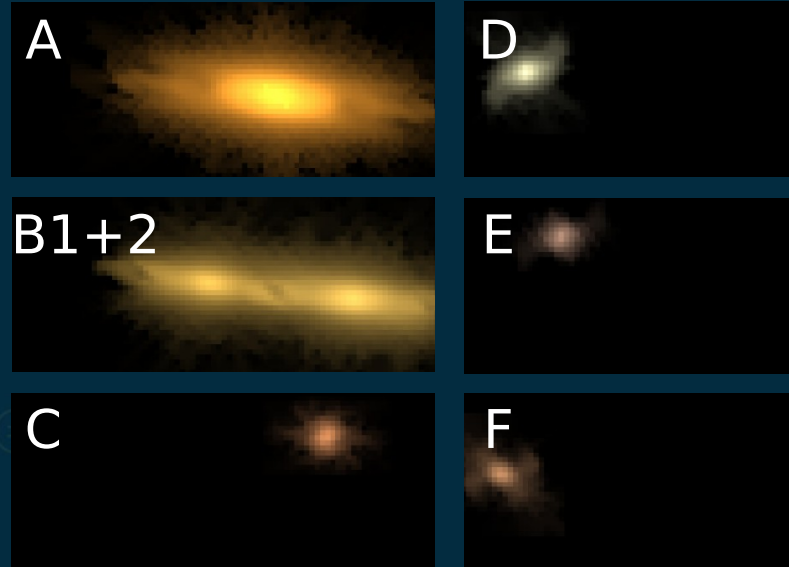
Science Pipelines Today

- Largely improvements on SDSS pipeline
- Used to process Subaru-HSC data; see Bosch+18
- Galaxy modelling on co-added single-band images

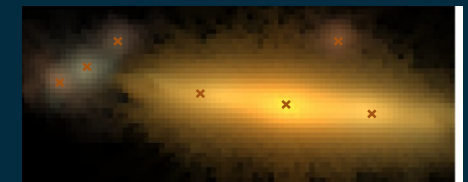


New Deblender - Scarlet

SCARLET



Model



Non-parametric SED & morphology solved via matrix factorization; see Melchior+18

$$\text{scene} = \sum_k \text{SED}_k \times \text{Morphology}_k + \text{noise}$$

Current Galaxy Models



- Multi-Gaussian/shapelet* PSF
- Three galaxy model fits:
 - Exponential (exp., Sersic $n=1$): disk-like
 - de Vaucouleurs (dev., Sersic $n=4$) bulge-like
 - CModel – linear combination of exp+dev
 - Bulge+disk like
- Not true Sersics but multi-Gaussian approximation
 - See Hogg & Lang 13
- Why? Fast & useful approximations

*Gaussians with Hermite polynomial perturbations; see Refregier 01

Re-thinking Galaxy Modelling



- What models should we fit? My biases:
 - add free single Sersic
 - better bulge+disk
 - 3+ component models (e.g. add point source)
- How do we determine the 'best' models to fit?
 - Fitting idealized templates not very useful
 - Want real galaxies @ \sim infinite S/N, resolution

Re-thinking Galaxy Modelling



- (How) Should we do:
 - Multi-wavelength
 - Multi-object
 - Multi-epoch

Re-thinking Galaxy Modelling

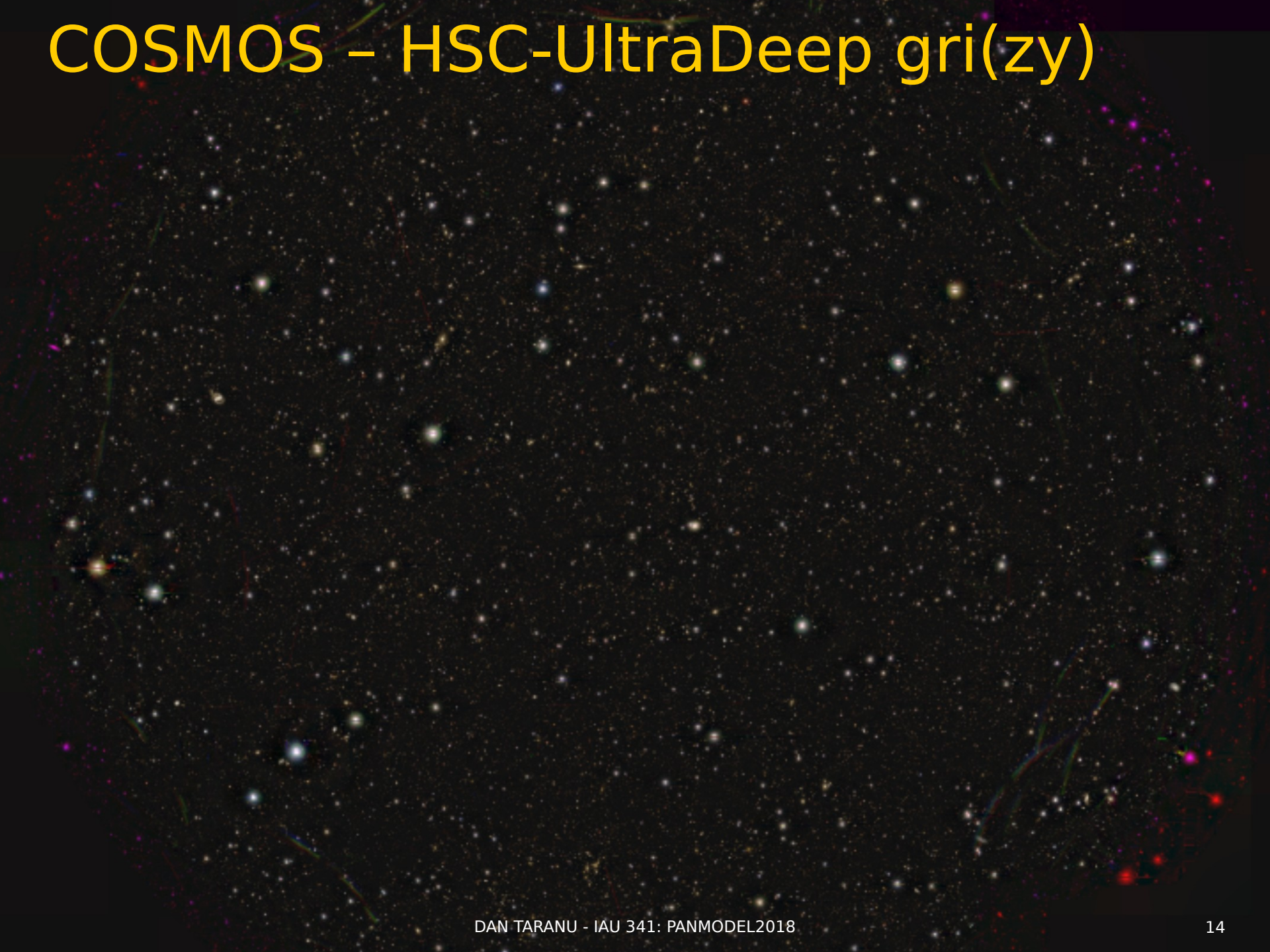


- (How) Should we do:
 - Multi-wavelength – **Yes**; free mag. per band
 - Multi-object – **Yes**; crowded fields?
 - Multi-epoch – **No**; unless necessary

COSMOS - HST F814W (i+z)



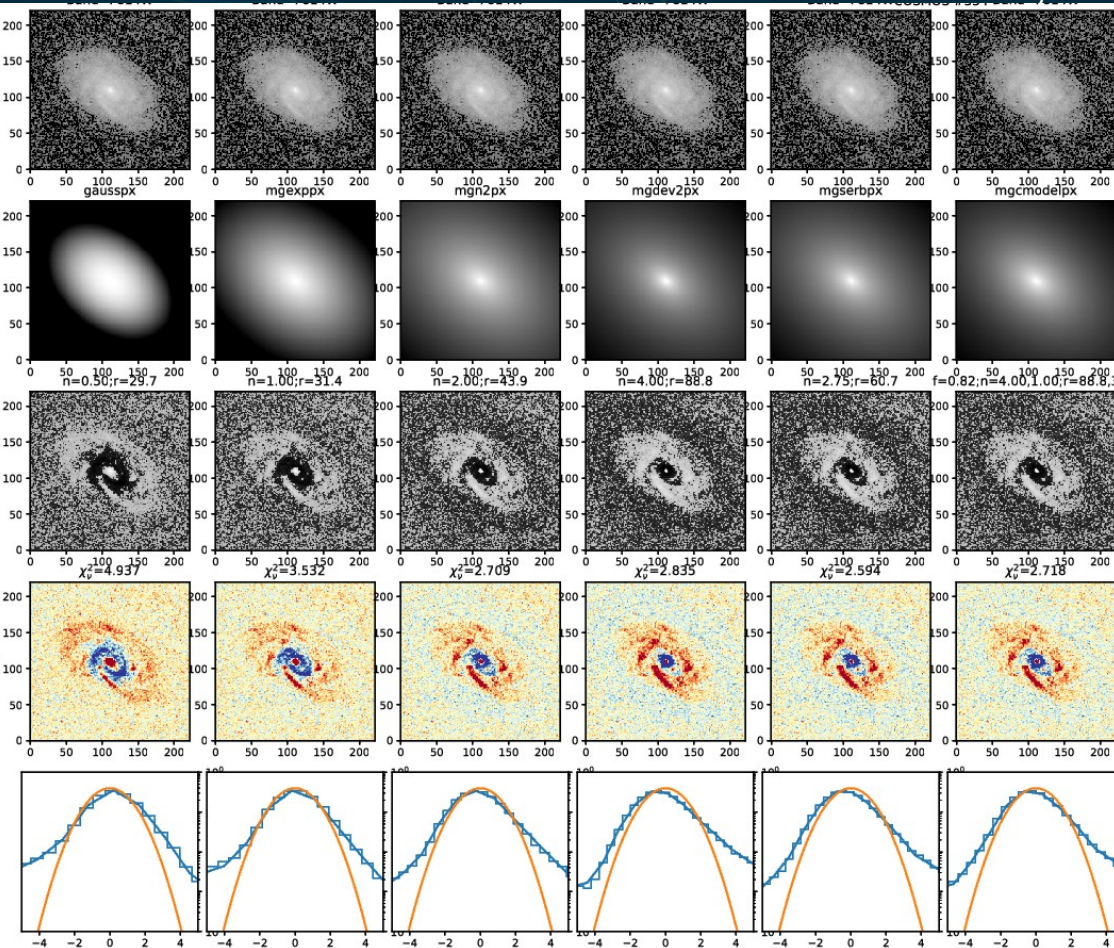
COSMOS – HSC-UltraDeep gri(zy)



Galaxy Models



					cModel
Gauss.	Exp.	n=2	deV.	Sersic	f=0.82
n=0.5	1	2	4	2.75	4, 1
Re=29.7	31.4	43.9	88.8	60.7	89, 31



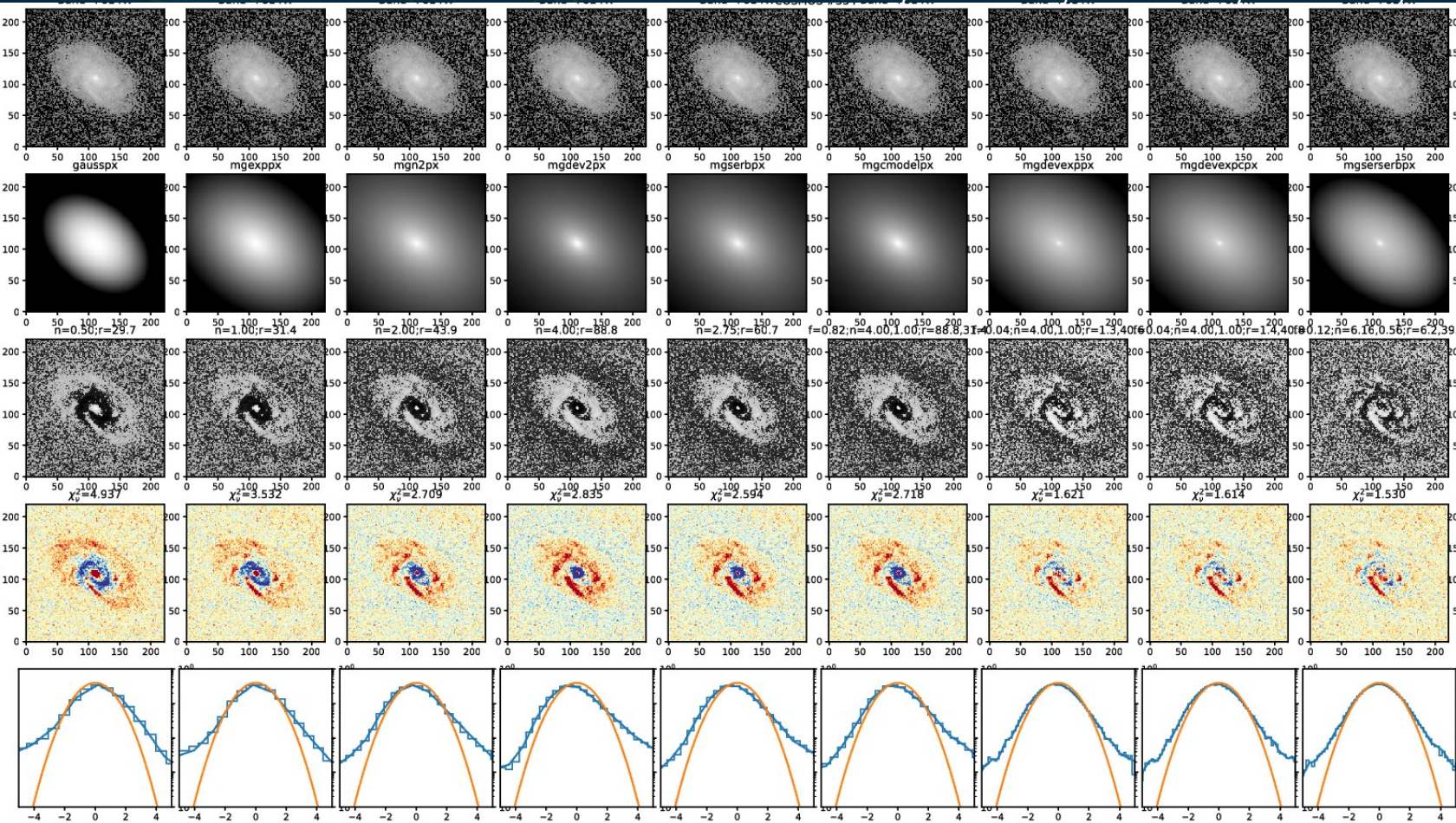
Data
Model
D-M
(D-M)/σ

$\chi^2_v = 4.937 \quad 3.532 \quad 2.709 \quad 2.835 \quad 2.594 \quad 2.718$

Galaxy Models



	Gauss.	Exp.	n=2	deV.	Sersic	cModel	devExp	devExp _c	2-Sersic
n=0.5	1	2	4	2.75	4, 1	4, 1	4, 1	6.2, 0.56	
Re=29.7	31.4	43.9	88.8	60.7	89, 31	1.3, 41	1.4, 41	6.2, 40	



Data
Model
D-M
(D-M)/σ

χ^2_{ν} = 4.937 3.532 2.709 2.835 2.594 2.718 1.621 1.614 1.530

*NOT 8-Gaussian approx.

8-Gaussian Mixture Model

2-Sersic model $\chi^2_{\nu} = 1.530$ (free ellipses)

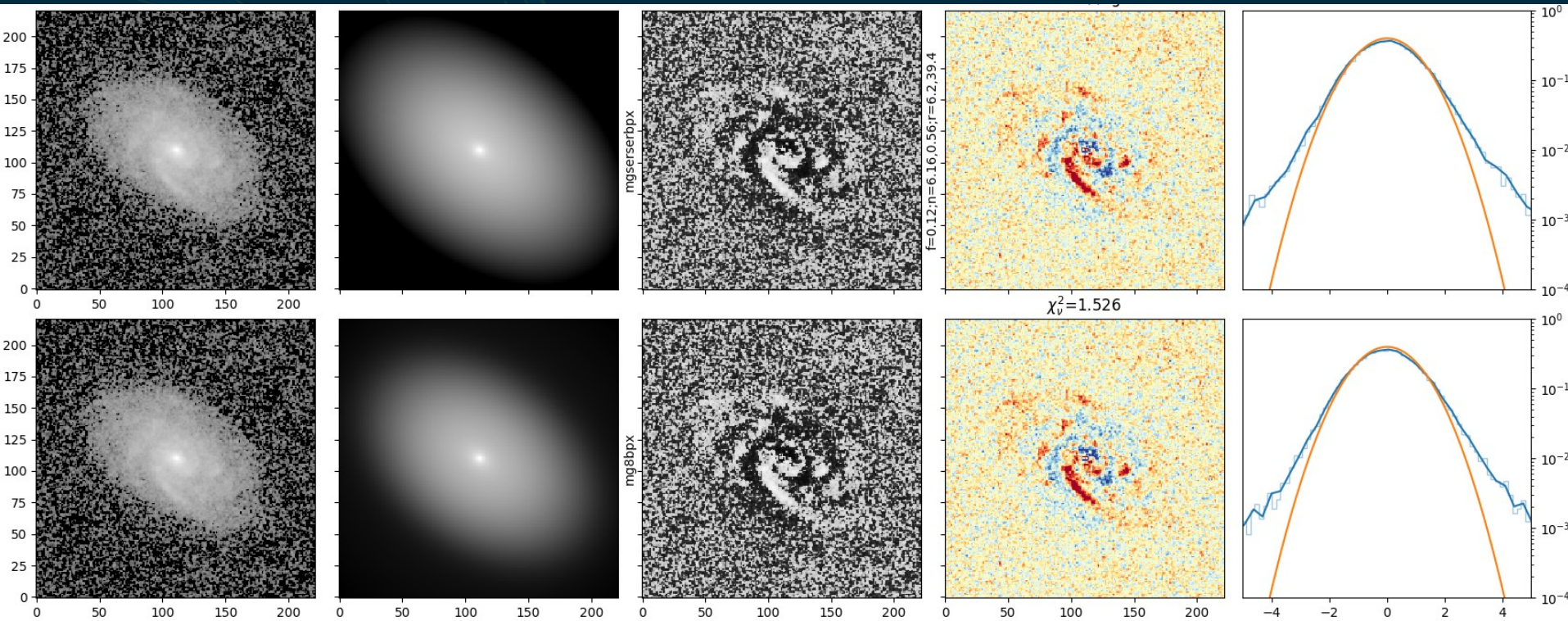
Data

Model

Residuals (D-M)

Residuals (D-M)/ σ

Residuals (D-M)/ σ



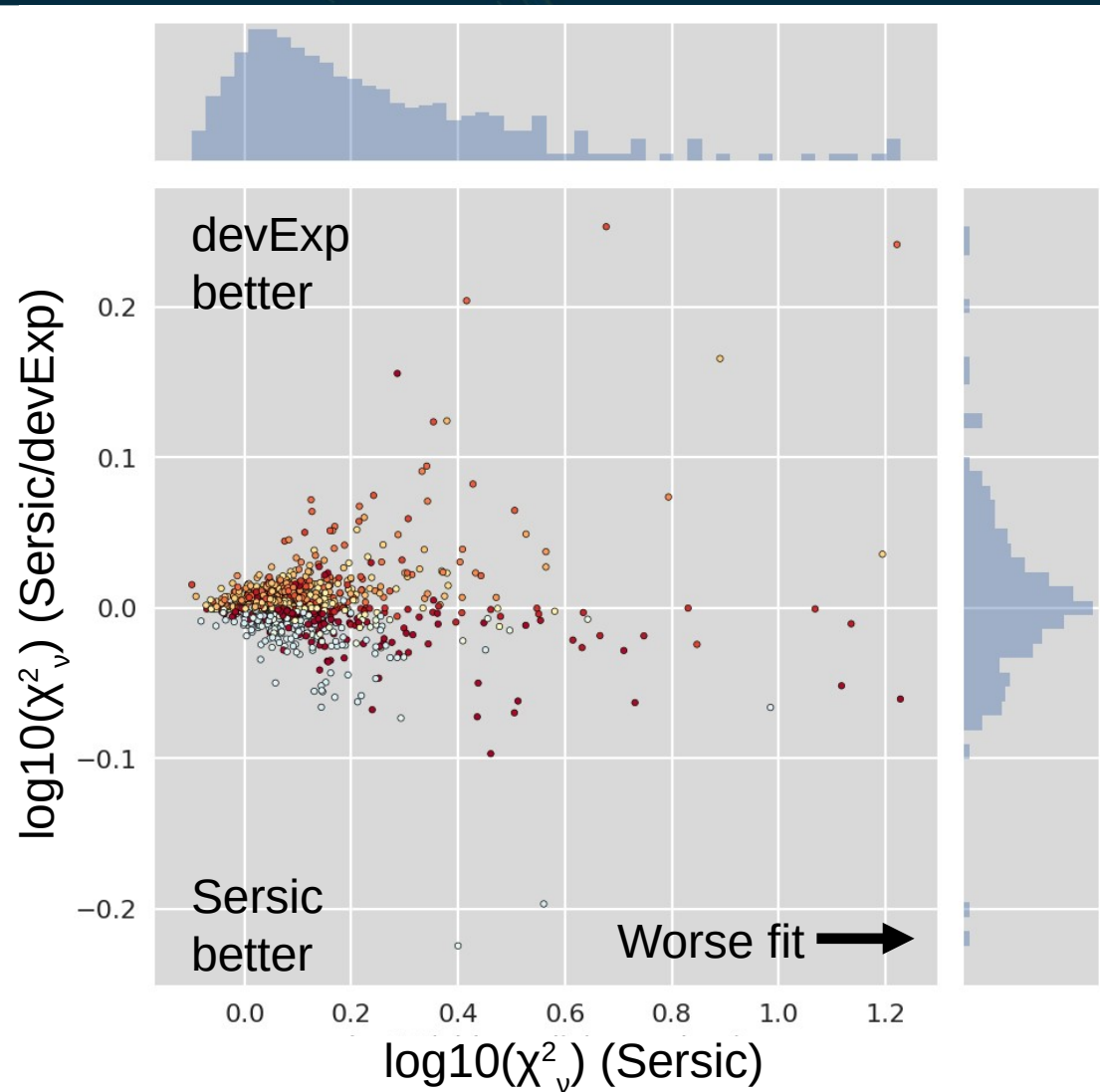
8-Gaussian model $\chi^2_{\nu} = 1.526$ (shared ellipse)

one component, non-parametric radial profile

Metrics for Model Fits



- COSMOS-HST: Sersic better than devExp for ~50%



Sersic $n=0.5$

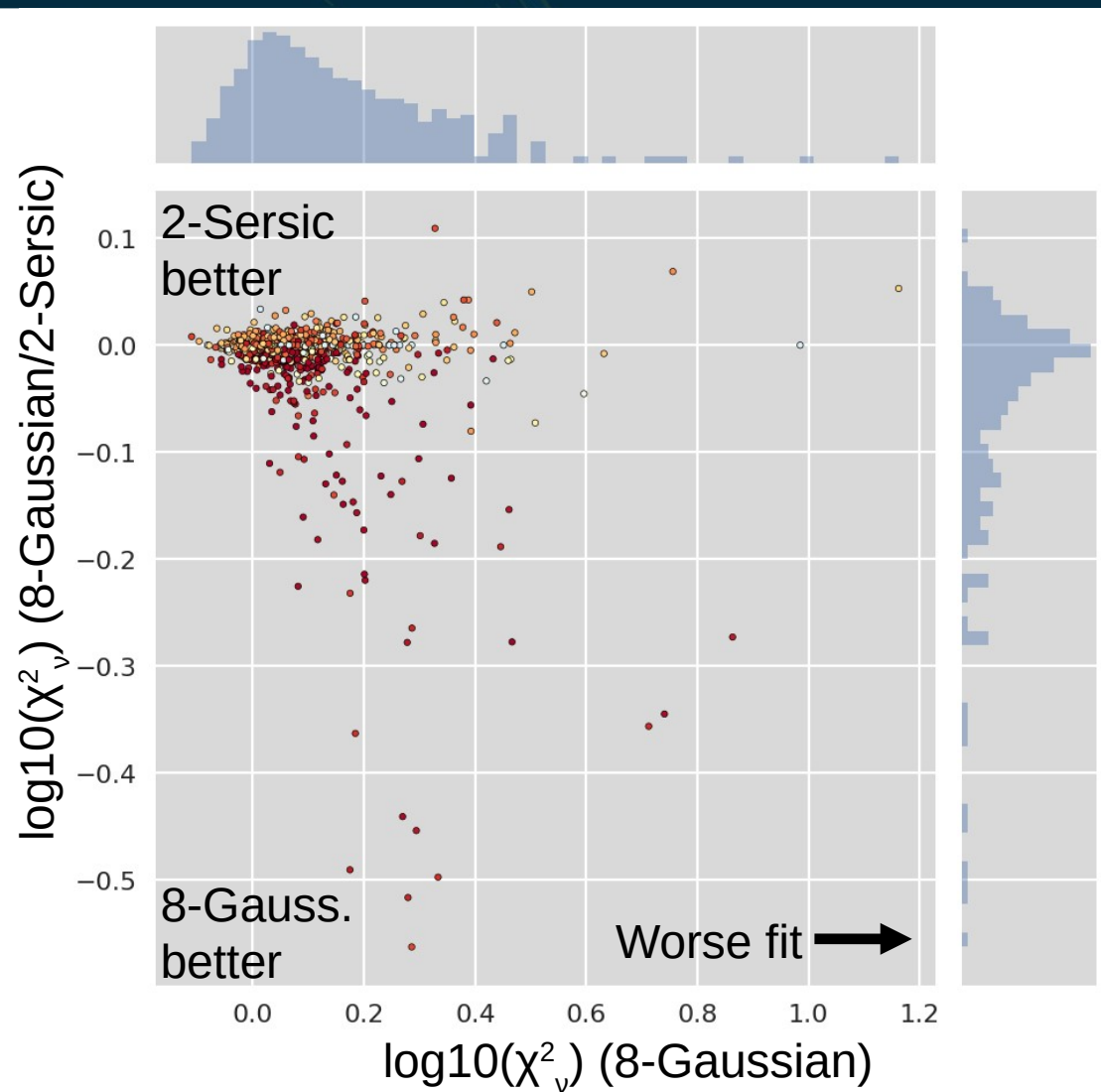
Sersic $n=2$

Sersic $n=6$

Metrics for Model Fits



- COSMOS-HST: 8-Gauss (same ellipses) vs 2-Sersic

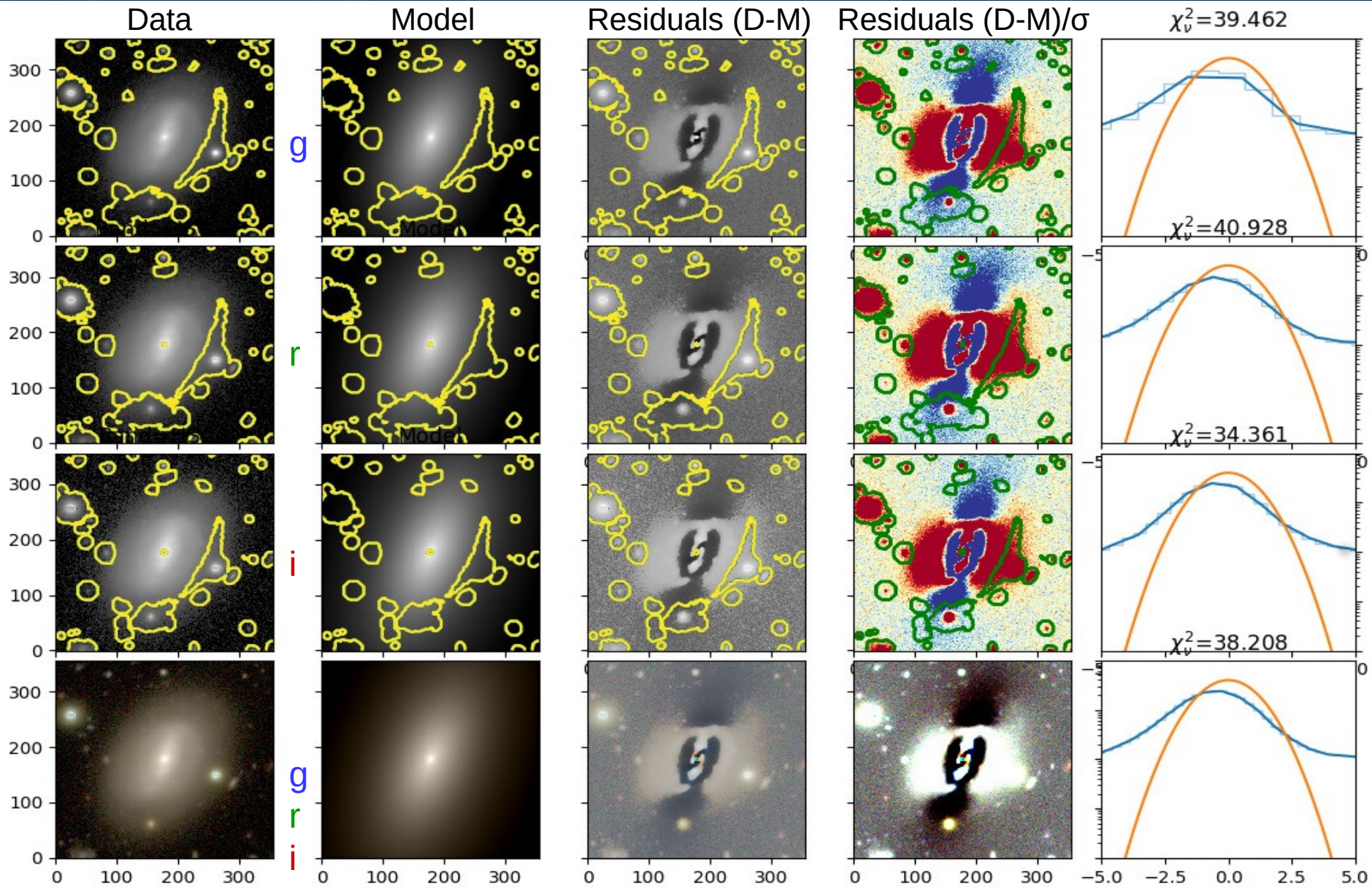


Sersic $n=0.5$

Sersic $n=2$

Sersic $n=6$

Experimental Multi-band Fits



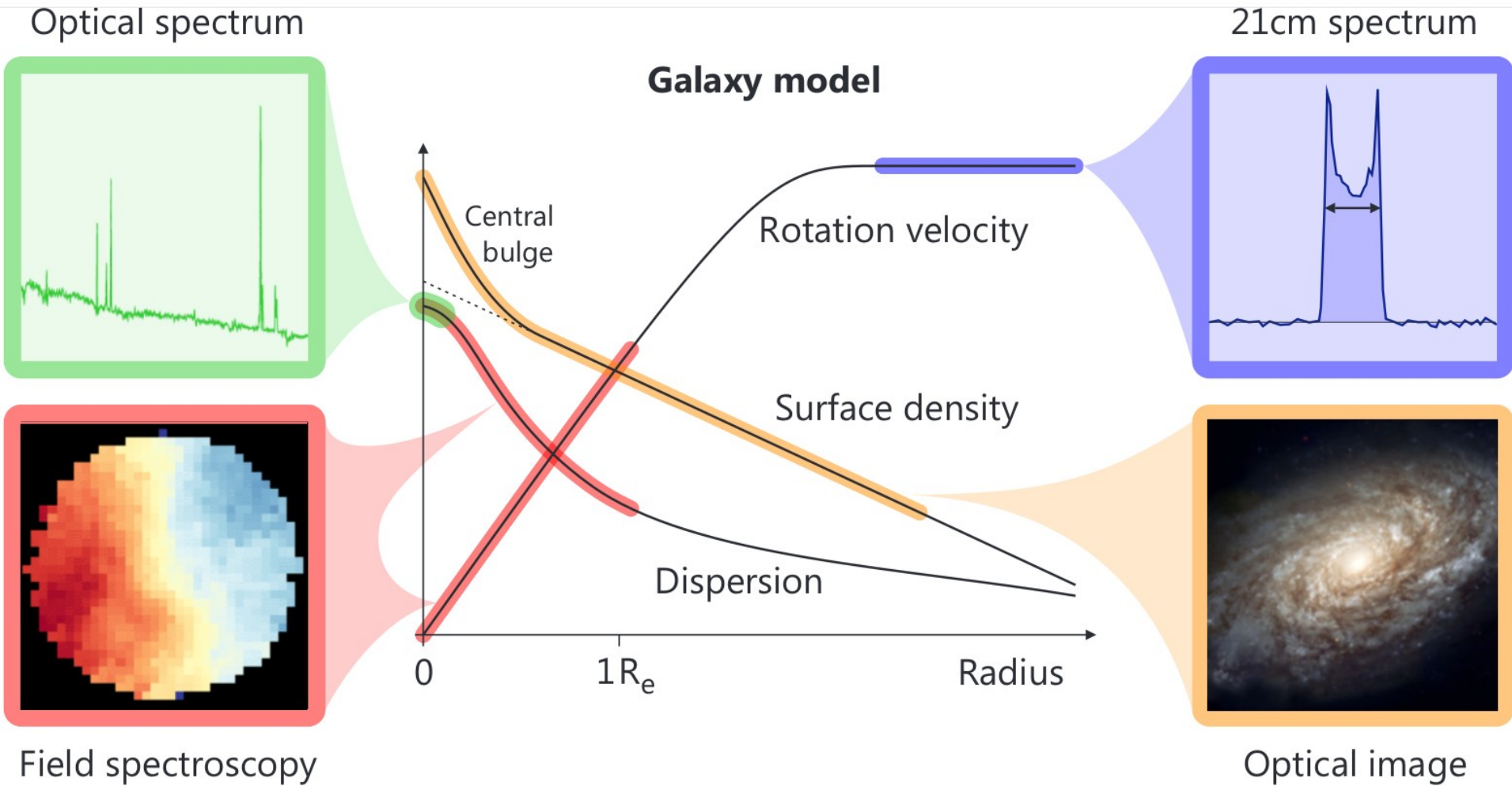
Conclusions



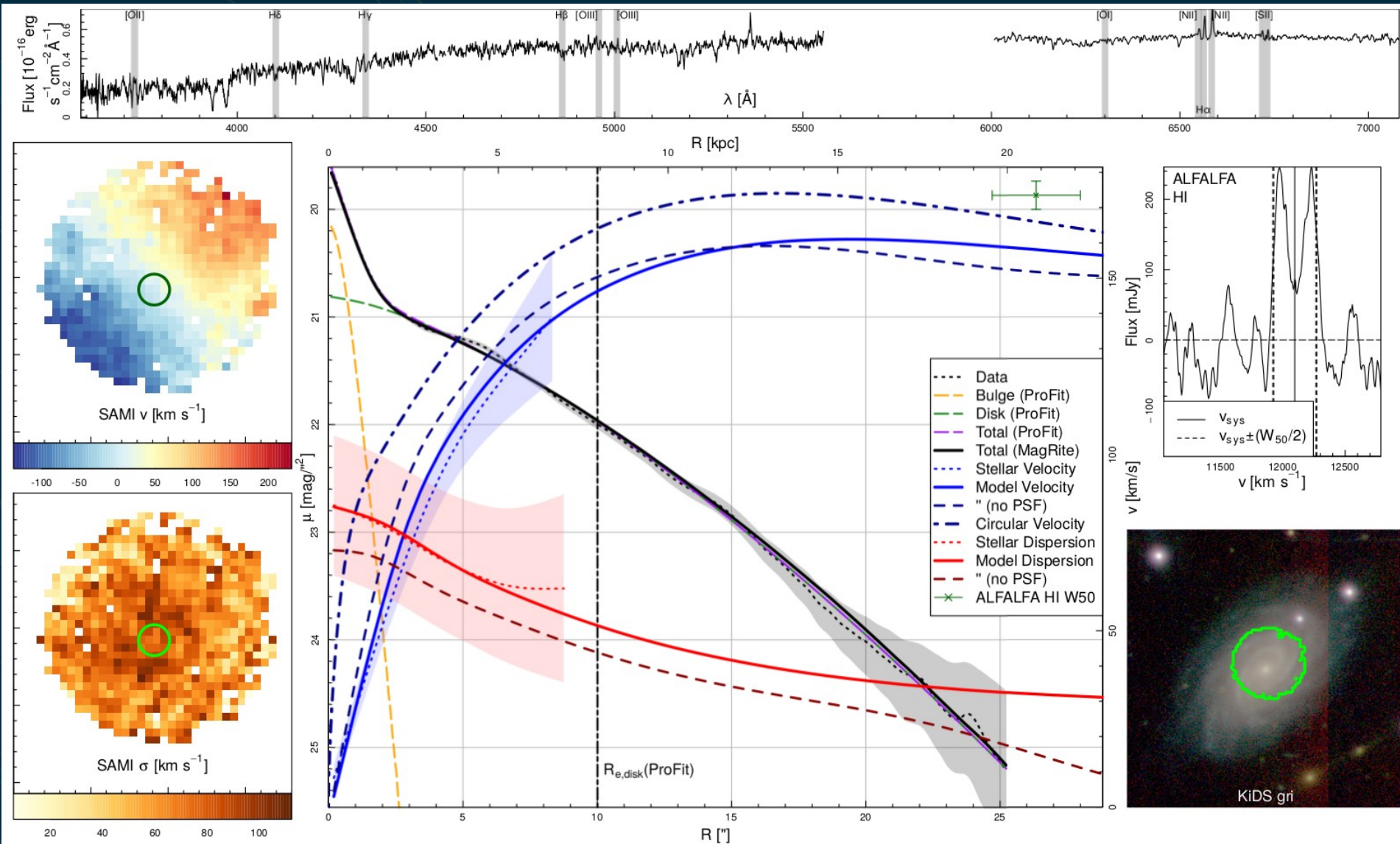
- LSST will detect billions of galaxies
 - The data will be big but manageable
 - The data is **complex**
- Data Management developing tools for turning pixels → (physical) parameters
 - New **deblender** Scarlet and **MultiProFit** (not TM)
 - Everything is open source!
 - **github.com/lst** – Science Pipelines
- See **lsst.org/participate** and **lsst.org/science**
 - Community-driven requirements guide design

But what about...

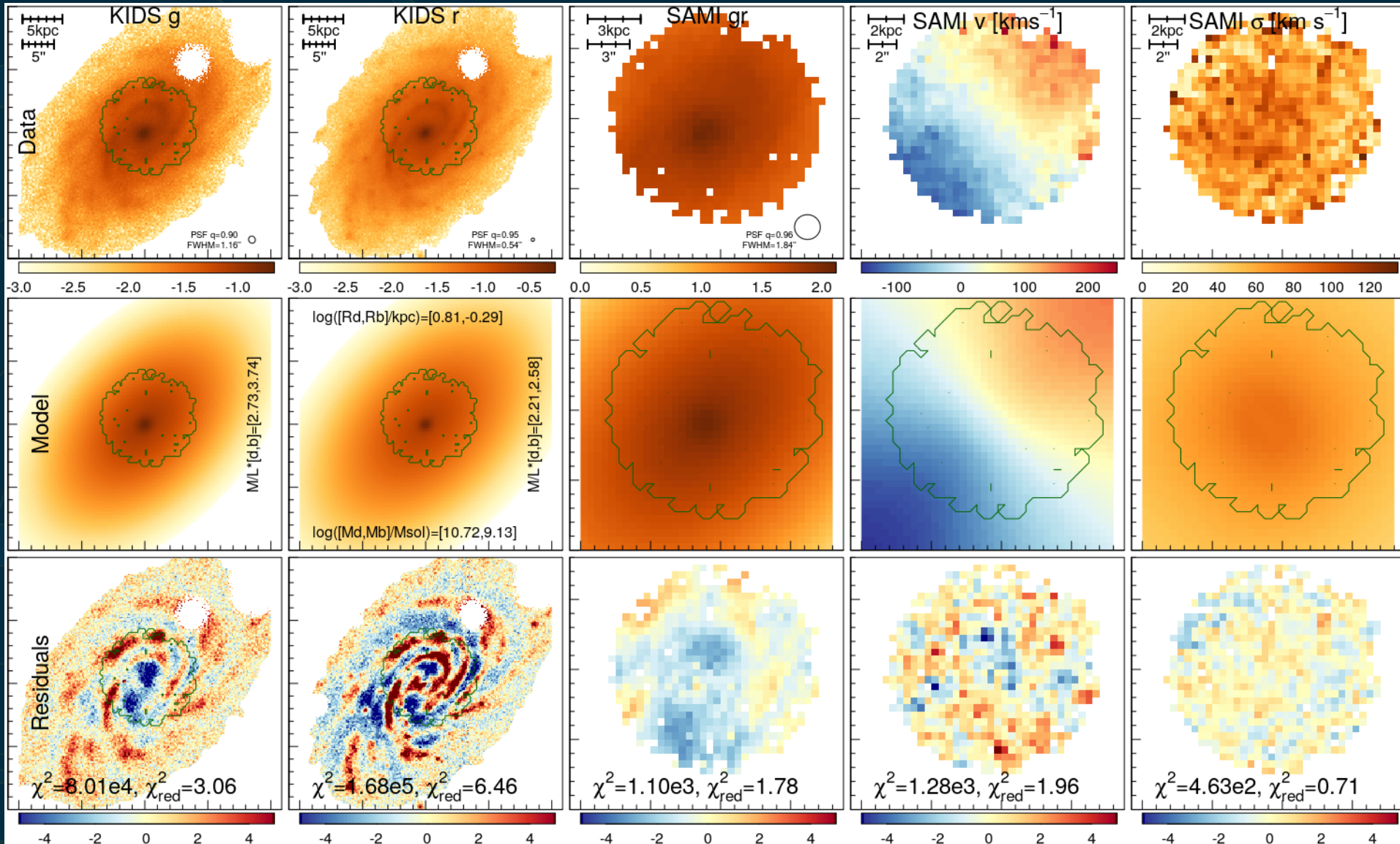
- I promised something about dynamical modelling:



MagRite (Taranu+17)



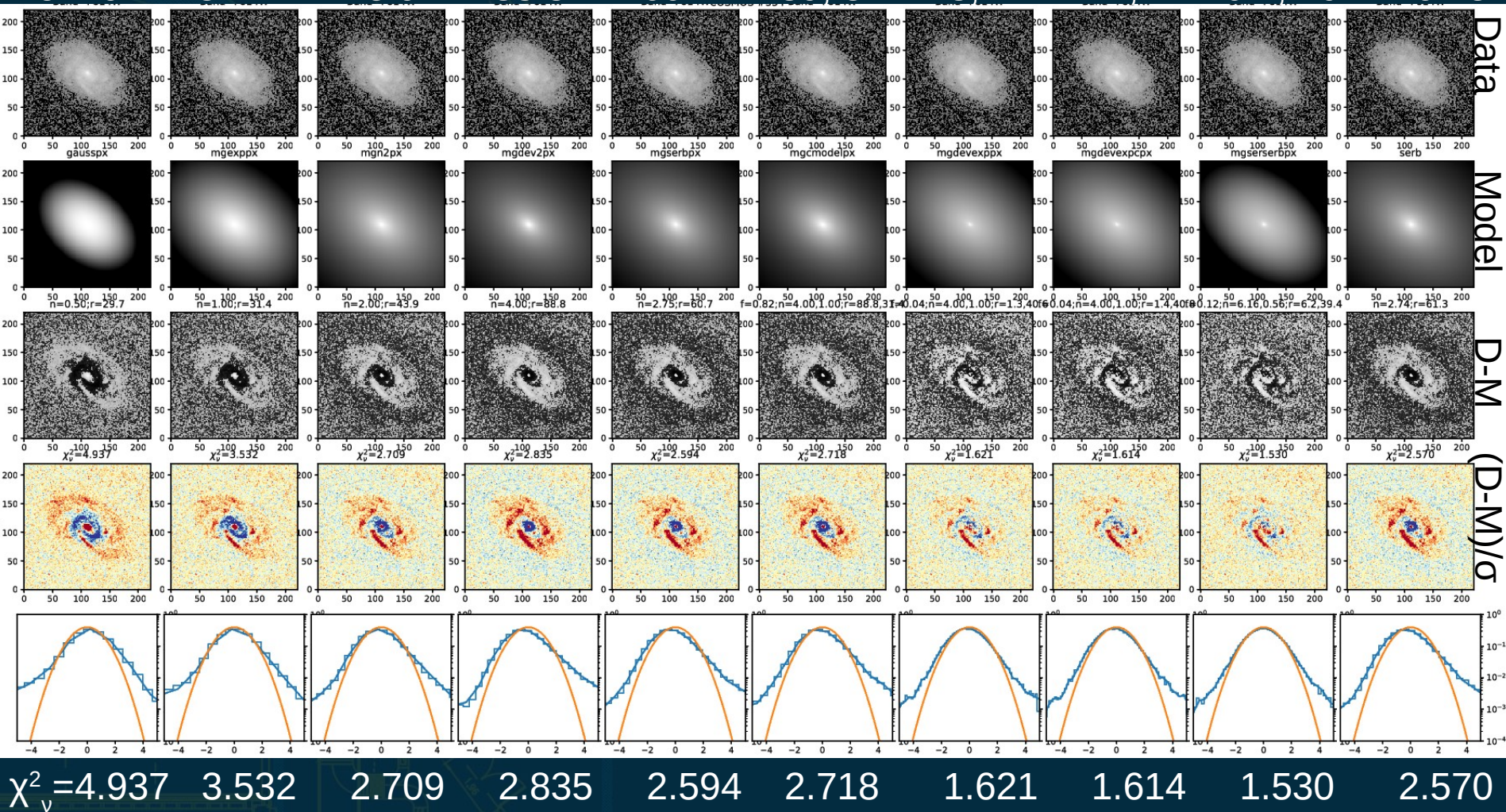
MagRite (Taranu+17)



Galaxy Models



Gauss.	Exp.	n=2	deV.	Sersic	cModel	devExp	devExp	2-Sersic	Sersic*
n=0.5	1	2	4	2.75	f=0.82	f=0.04	f=0.04	f=0.12	2.74
Re=29.7	31.4	43.9	88.8	60.7	89, 31	1.3, 41	1.4, 41	6.2, 40	61.3

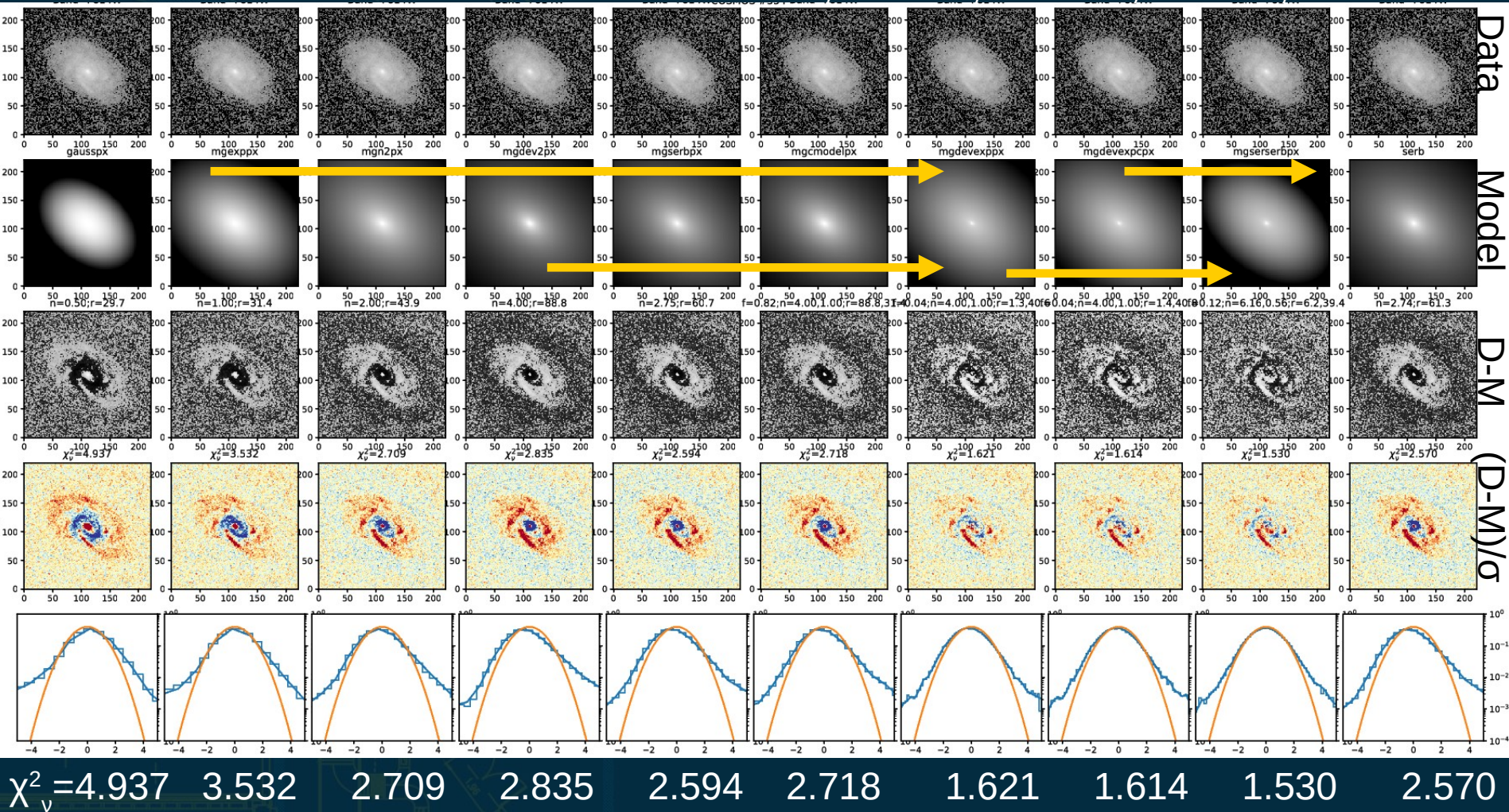


*NOT 8-Gaussian approx.

Galaxy Models



	Gauss.	Exp.	n=2	deV.	Sersic	cModel	devExp	devExp _c	2-Sersic	Sersic*
n=0.5	1	2	4	2.75	4, 1	4, 1	4, 1	6.2, 0.56	2.74	
Re=29.7	31.4	43.9	88.8	60.7	89, 31	1.3, 41	1.4, 41	6.2, 40	61.3	



*NOT 8-Gaussian approx.