

**Informing low  
surface-brightness  
astronomy with the  
Rubin Observatory  
using the next  
generation of  
cosmological  
simulations**

**Garreth Martin**

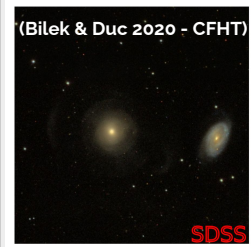
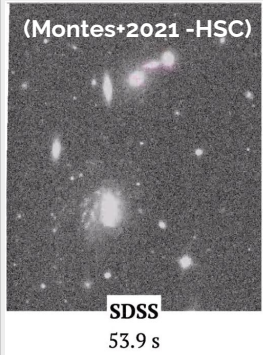
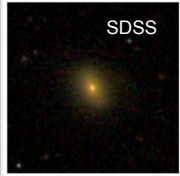
*with*

**LSST Galaxies LSB Working Group**

Tucson, 2022-09-08

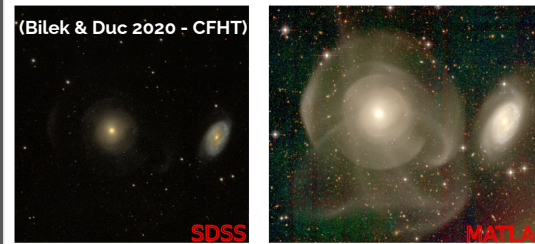
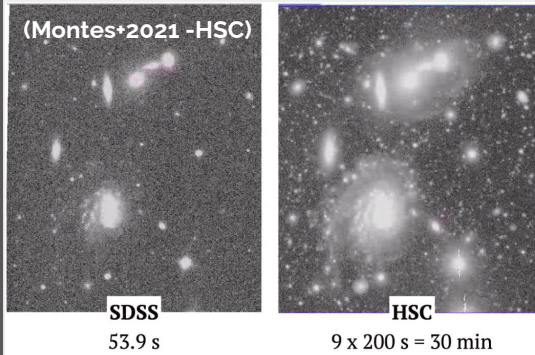
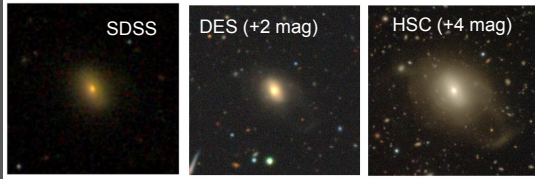
# Deep imaging in the era of the Rubin Observatory/LSST

- Rubin Observatory pathfinders like Subaru / Hyper-SuprimeCam give us some idea of the quality imaging that can be expected of the Rubin Observatory ( $\mu_r^{\text{lim}}(3\sigma, 10'' \times 10'') > 30.5 \text{ mag arcsec}^{-2}$ )



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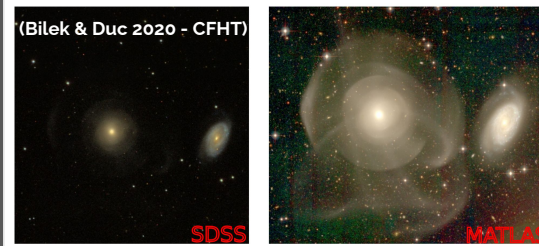
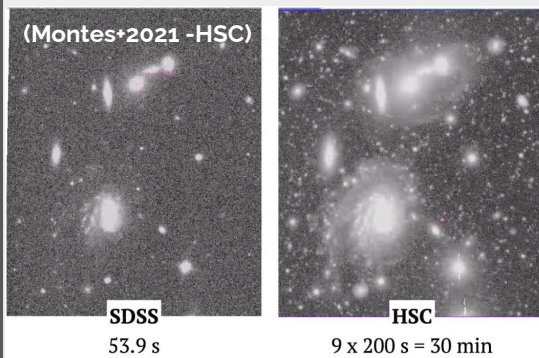
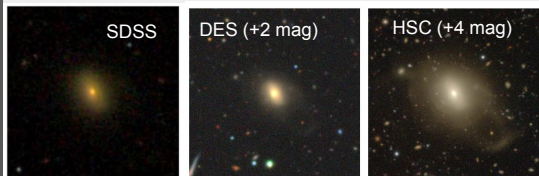
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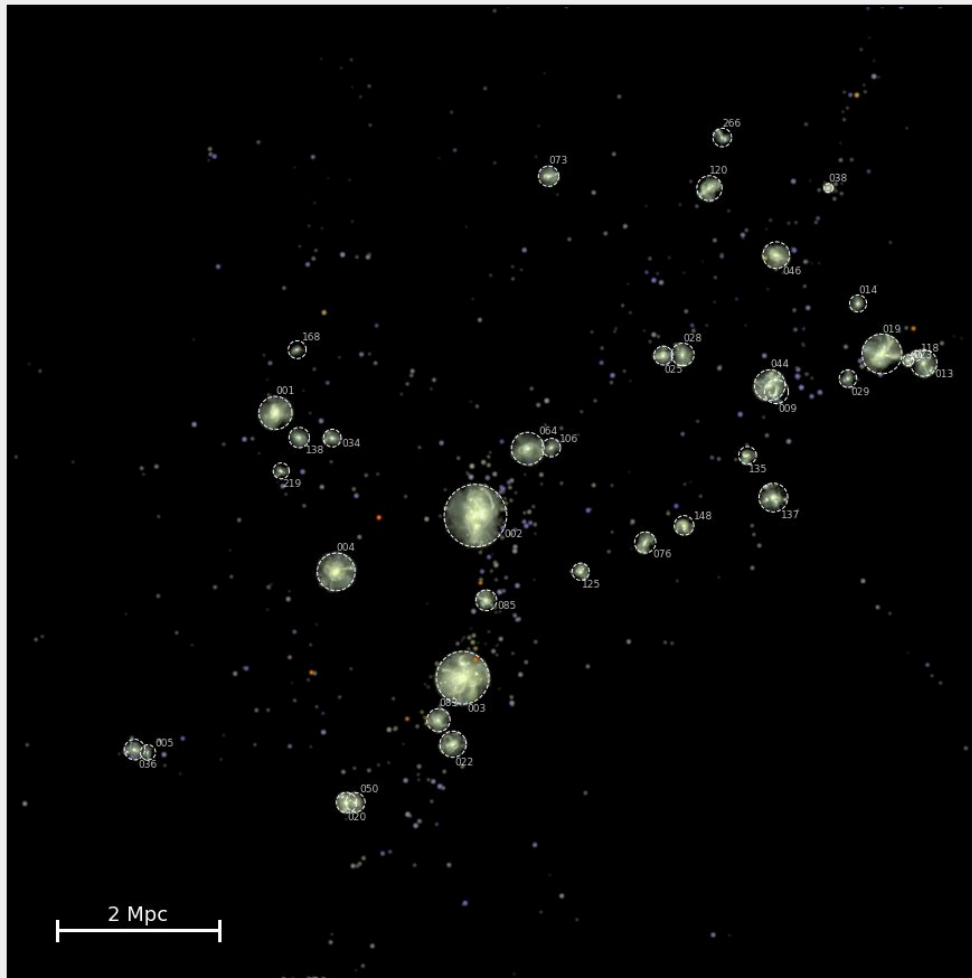
## Deep imaging in the era of the Rubin Observatory/LSST

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- Rubin Observatory will greatly increase the sample size of galaxies with similar quality observations
  - Detailed  $\Lambda$ CDM predictions will allow us to understand the capabilities of this new dataset and make predictions for
    - Frequency and distribution of tidal features as a function of halo mass
    - Detectability of tidal features
    - Biases from orientation, redshift, etc.

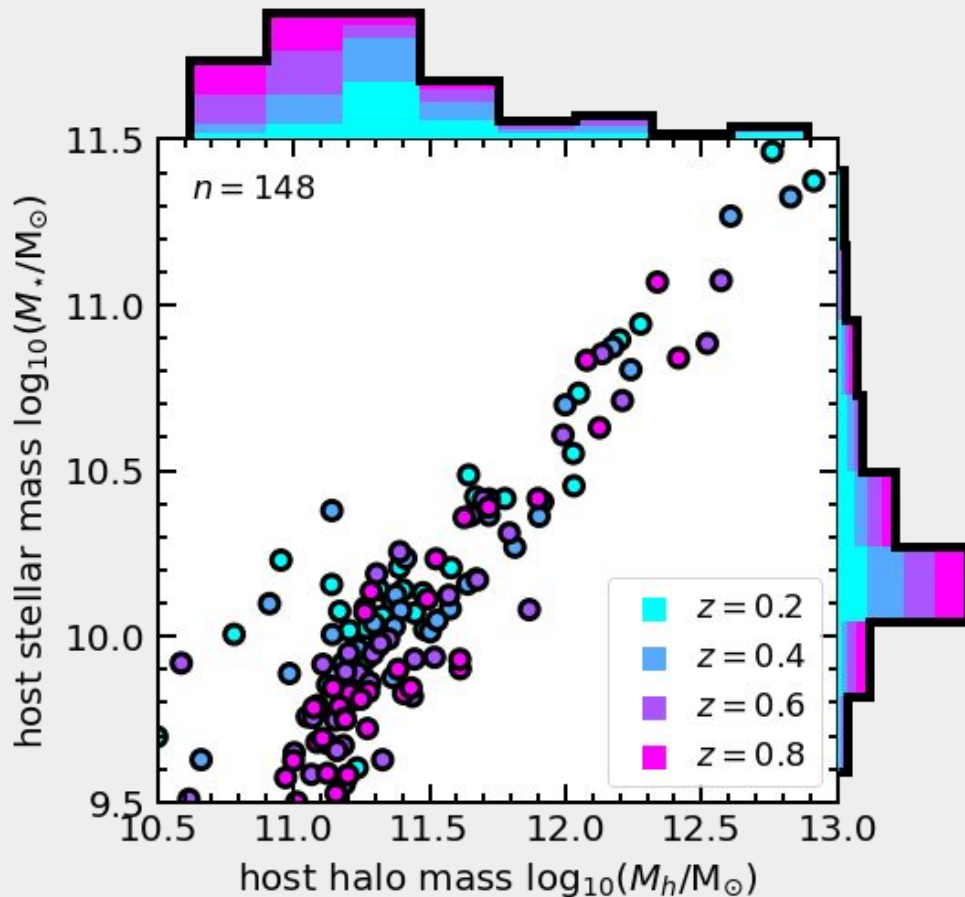


# The New Horizon Simulation (Dubois+21)

- **New Horizon is a high resolution cosmological simulation**
  - Contiguous volume of  $(16 \text{ Mpc})^3$
  - High spatial and stellar mass resolution of  $34 \text{ pc} / 10^4 M_{\odot}$
  - Sufficient mass resolution to resolve the stellar halo around <MW mass galaxies

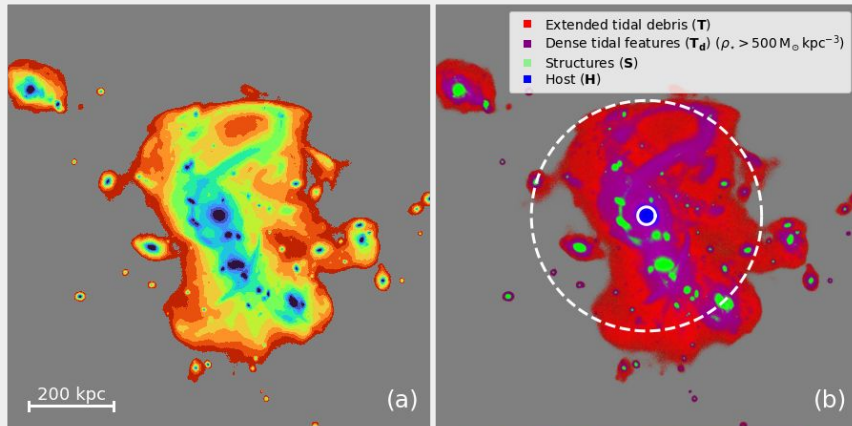


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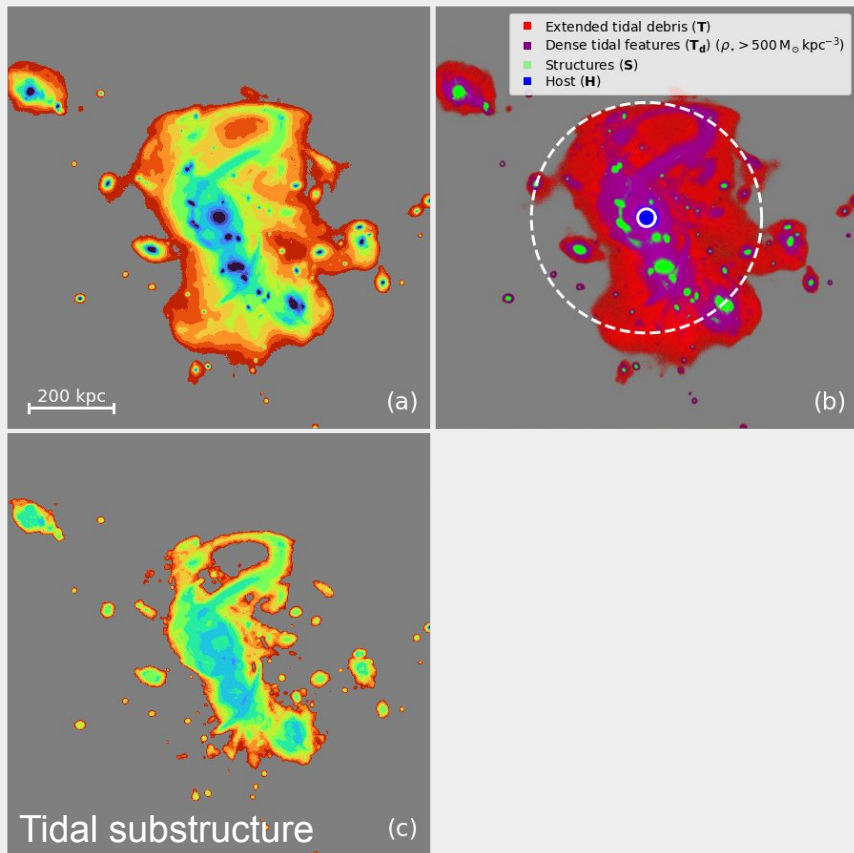
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- **Sample**
  - $\log_{10}(M_*/M_\odot) = 9.5 \rightarrow 11.5$
  - 4 different simulation snapshots
  - ~150 objects

# Measuring flux distributions in the stellar halo



- Decompose galaxy stellar haloes into:

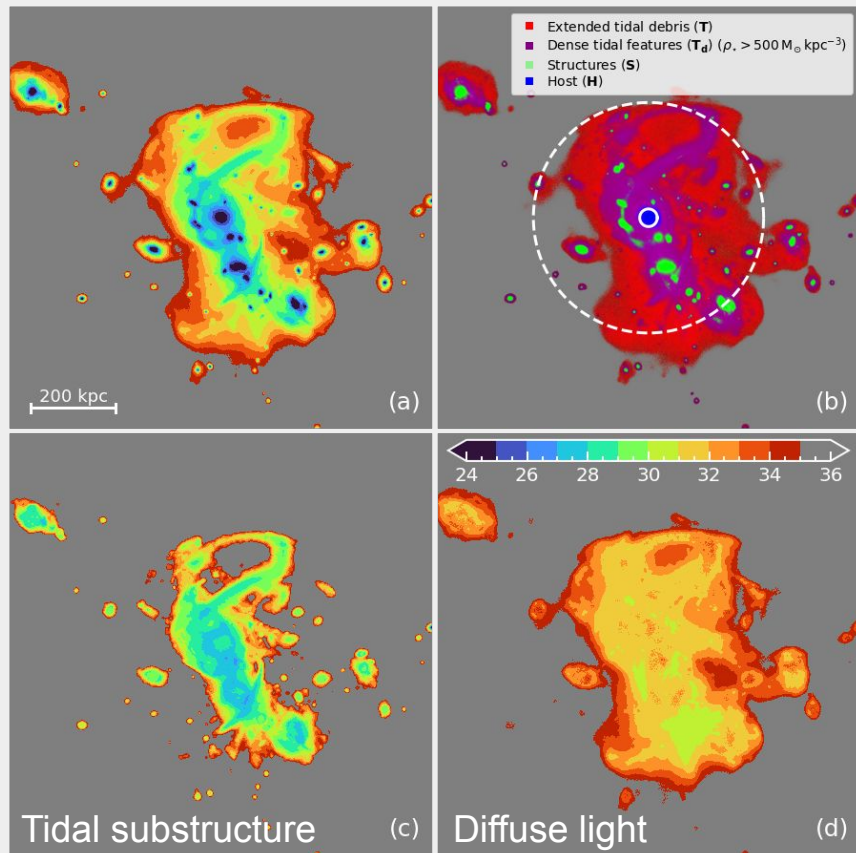
# Measuring flux distributions in the stellar halo



- Decompose galaxy stellar haloes into:
  - Dense tidal substructures (density cut maximising high spatial frequency features  $< 50 \text{ kpc}$  [Sola+2022](#))



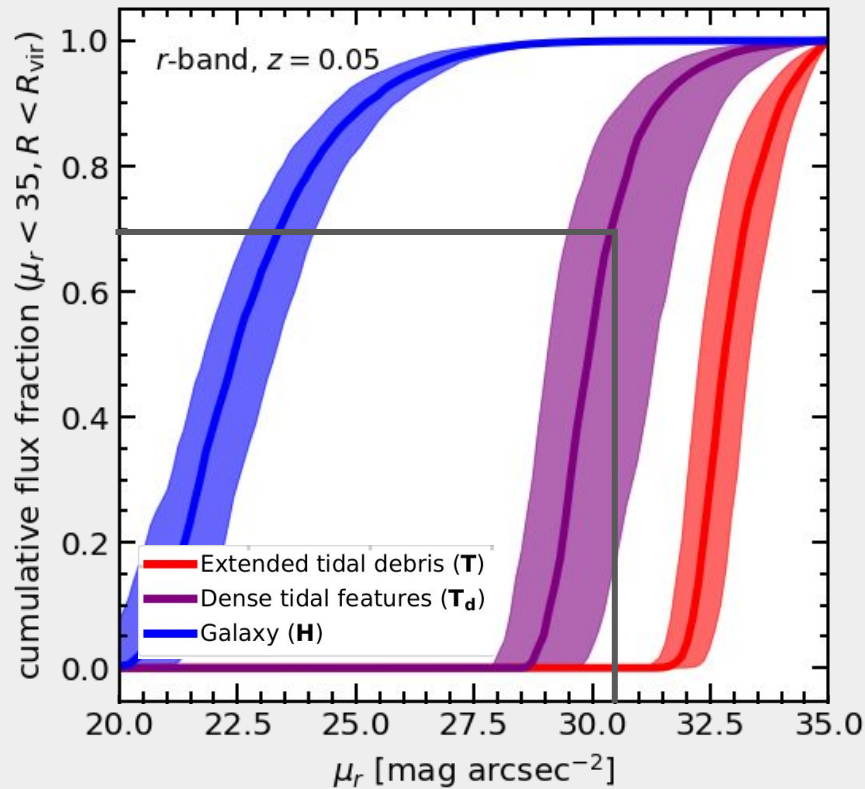
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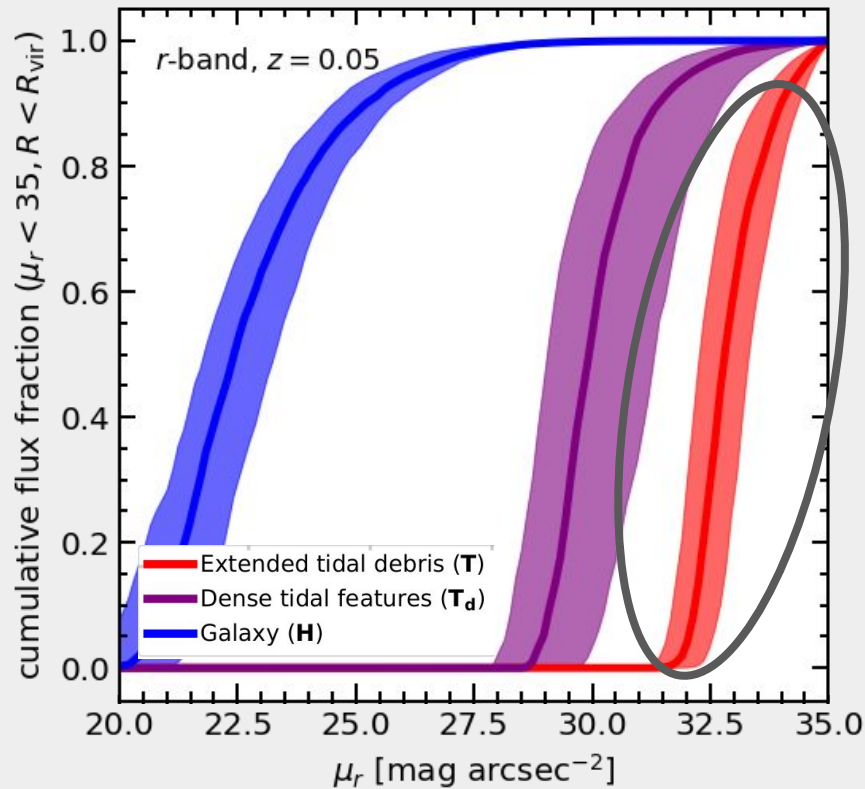
- Decompose galaxy stellar haloes into:
  - Dense tidal substructures (density cut maximising high spatial frequency features  $< 50 \text{ kpc}$  [Sola+2022](#))
  - Diffuse light / debris (low spatial frequency features)

# Measuring flux distributions in the stellar halo

- SB limit of 30.5 mag / sq. arcsec is sufficient to recover over half the flux within tidal features



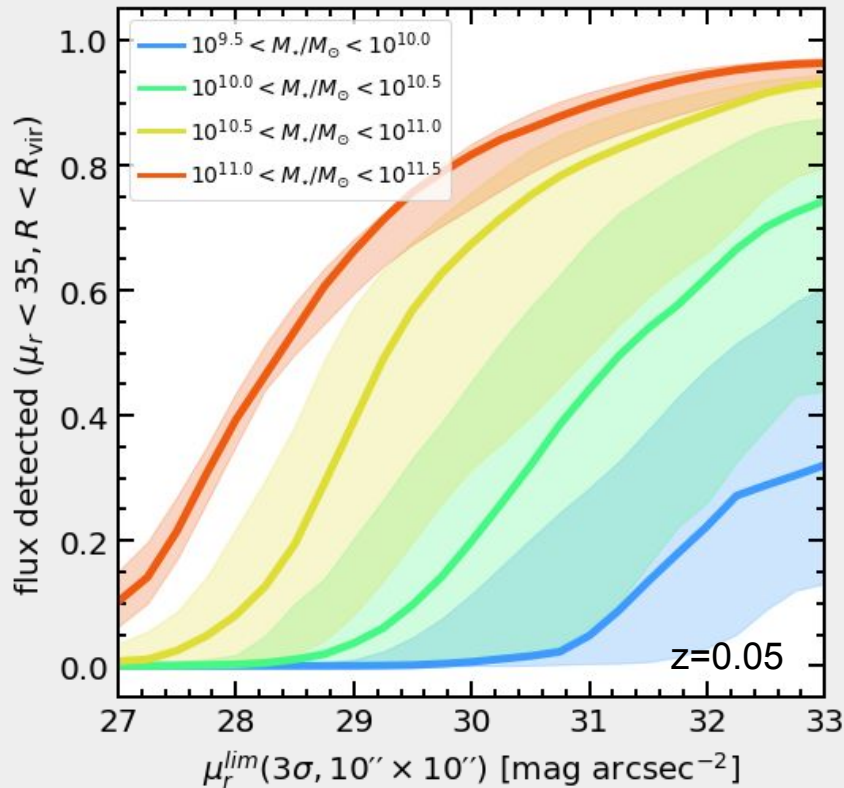
# Measuring flux distributions in the stellar halo

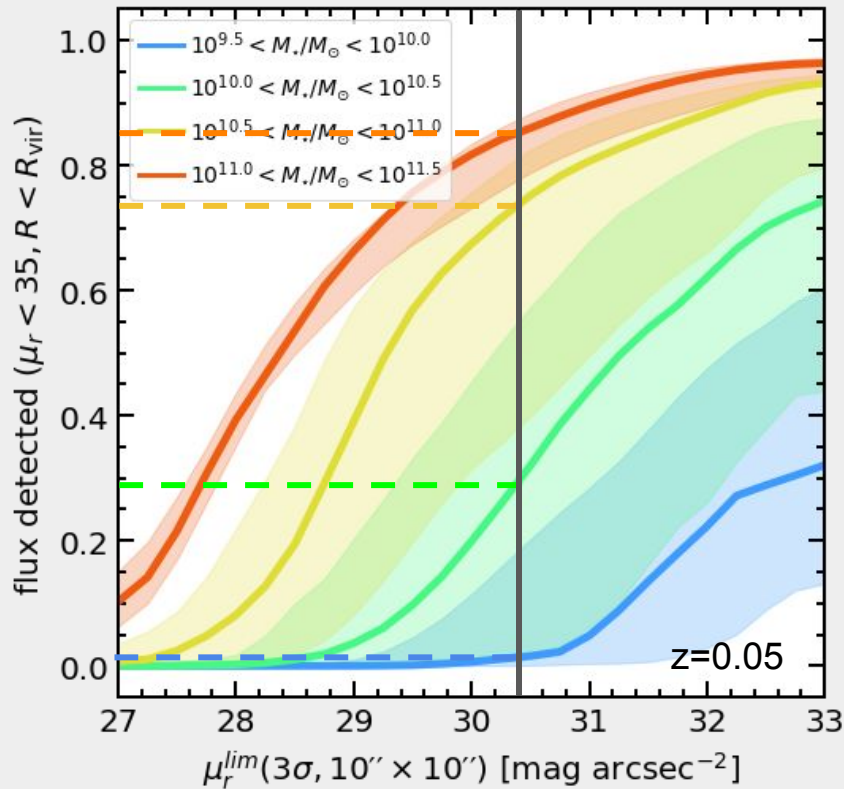


- SB limit of 30.5 mag / sq. arcsec is sufficient to recover over half the flux within tidal features
- Very diffuse light in the stellar halo is inaccessible (without binning) at expected LSST SB limits
  - It accounts for 25% of the total halo light on average

# Measuring flux distributions in the stellar halo

- In the nearby Universe ( $z \sim 0.05$ ), lower mass galaxies ( $M_*/M_\odot < 10^{10}$ ) remain unlikely to host detectable tidal features at Rubin Observatory 10-year depth.

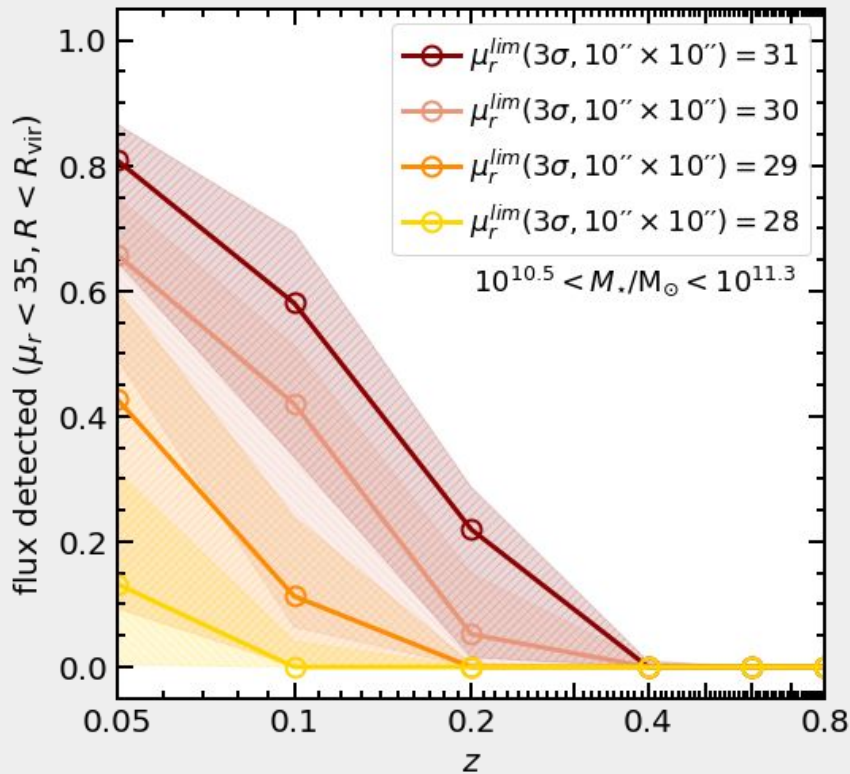




## Measuring flux distributions in the stellar halo

- In the nearby Universe ( $z \sim 0.05$ ), lower mass galaxies ( $M_*/M_\odot < 10^{10}$ ) remain unlikely to host detectable tidal features at Rubin Observatory 10-year depth.
- But a majority of massive galaxies host tidal features with detectable flux at 10-year depth
  - 80% in MW mass galaxies or 60% with a more conservative  $29.5 \text{ mag arcsec}^{-2}$  cut



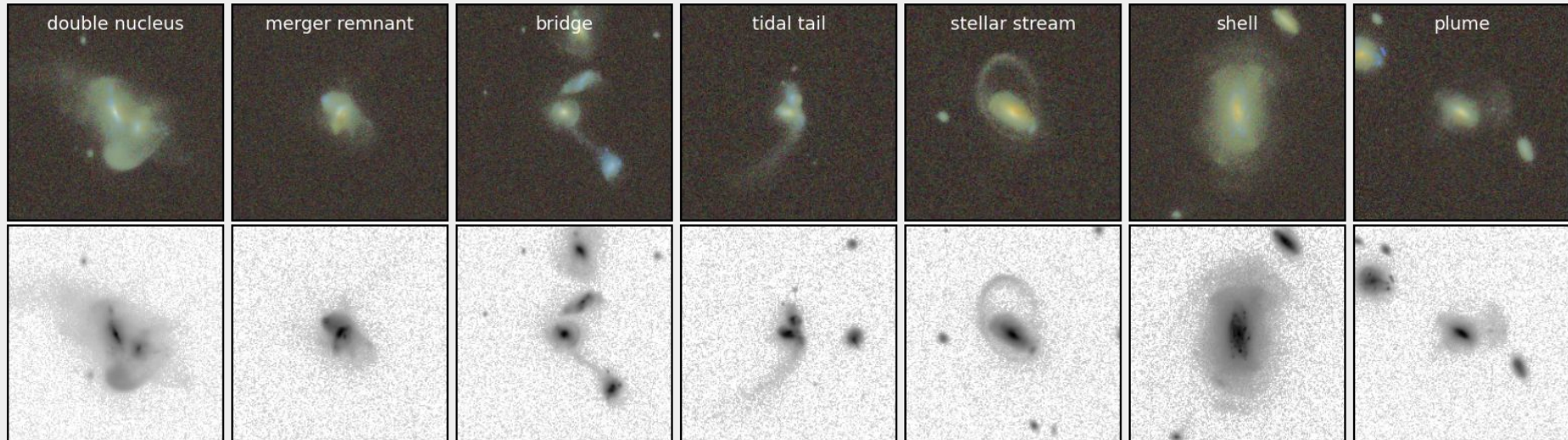


## Measuring flux distributions in the stellar halo

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- But a majority of massive galaxies host tidal features with detectable flux at 10-year depth
  - 80% in MW mass galaxies or 60% with a more conservative 29.5 mag arcsec<sup>-2</sup> cut
- Falling with redshift so that <10% flux in the stellar haloes of MW mass galaxies is detected by  $z=0.2$  for a 30.5 mag arcsec<sup>-2</sup> cut

# Visually classifying LSB features in the stellar halo

- ~50 volunteers visually classified tidal features mock Rubin Observatory images
  - Classified for a range of:
    - Limiting surface brightness (single visit  $\rightarrow$  10 year depth + 35 mag arcsec<sup>-2</sup> to probe beyond the limits of LSST)
    - Redshift ( $z = 0.05 \rightarrow 0.8$ )
    - Orientations (projected along  $xy$ ,  $xz$ ,  $yz$ )



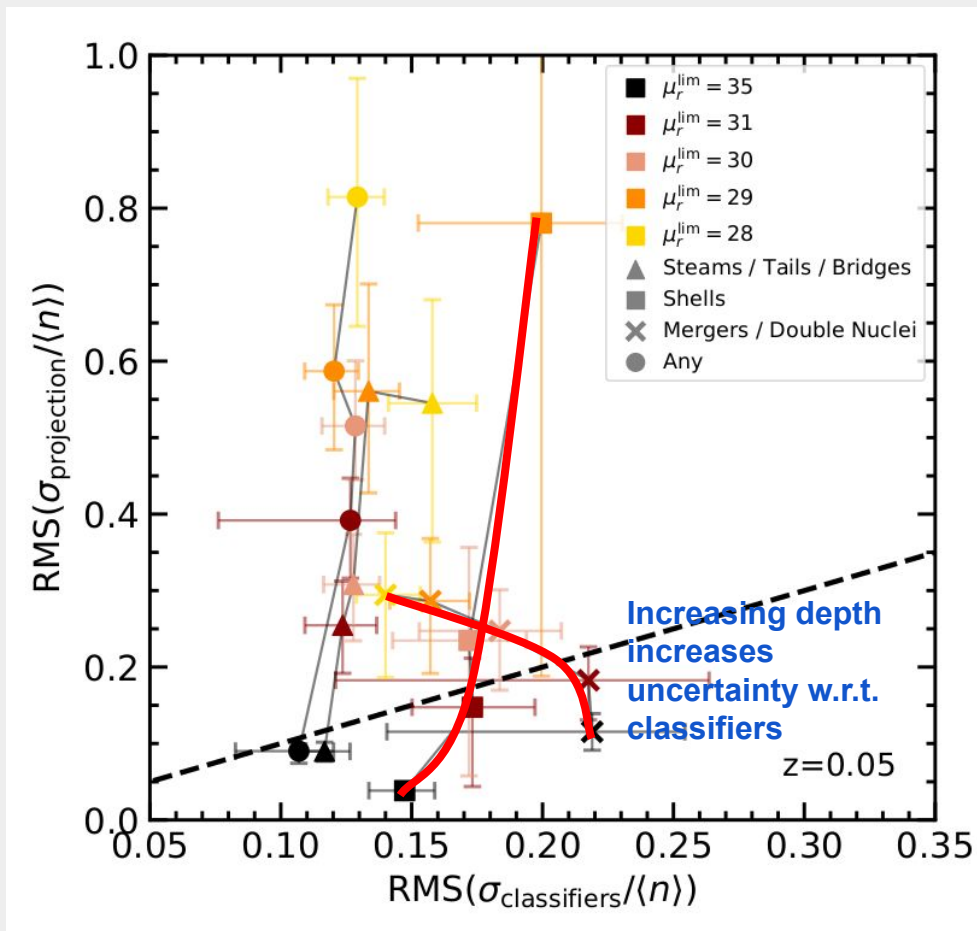
# Visually classifying LSB features in the stellar halo

- Sources of uncertainty
  - Limiting surface brightness
  - Surface brightness dimming and decrease in spatial resolution with redshift
  - Orientation
  - PSF
  - Chance projection of other objects
  - Ambiguity in tidal feature classification



# Visually classifying LSB features in the stellar halo

- We explore how the scatter in visual classifications changes with image depth
  - We consider the average scatter in classifications among different classifiers for the same image vs the average scatter in classifications for different projections of the same object
- In most cases, deeper imaging means classifiers and more likely to agree with each other and agree across projections
- However, for some categories, increasing the depth makes classification ambiguous
  - As depth improves, morphologies can become more complex, introducing uncertainty in precise characterisation
- Generally, there is significant disagreement between human classifiers at achievable limiting surface brightnesses



# Conclusions and future plans

## Conclusions

- After its 10 year survey, LSST will have sufficient depth to resolve a significant fraction of the flux found in tidal substructures of MW galaxy stellar haloes
- Around 75% of flux lies in these denser tidal features rather than more diffuse tidal debris which lie beyond the surface brightness limits accessible to LSST
- At sufficient depth, almost 100% of galaxies ( $M_*/M_\odot < 10^{9.5}$ ) possess tidal features
- Surface brightness limits, galaxy orientation, redshift, etc. have a clear effect on the ability of expert classifiers to visually identify and characterise tidal features
- Concurrence between classifiers generally improves with deeper imaging but morphologies can become more complex, introducing uncertainty in precise characterisation

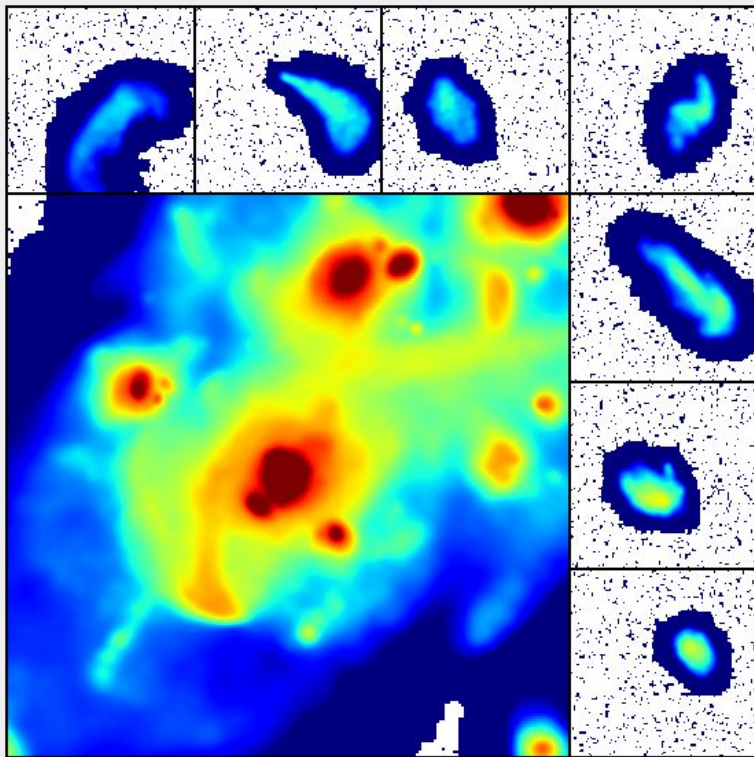
**MNRAS, 513, 1, pp.1459-1487, arXiv:2203.07675**

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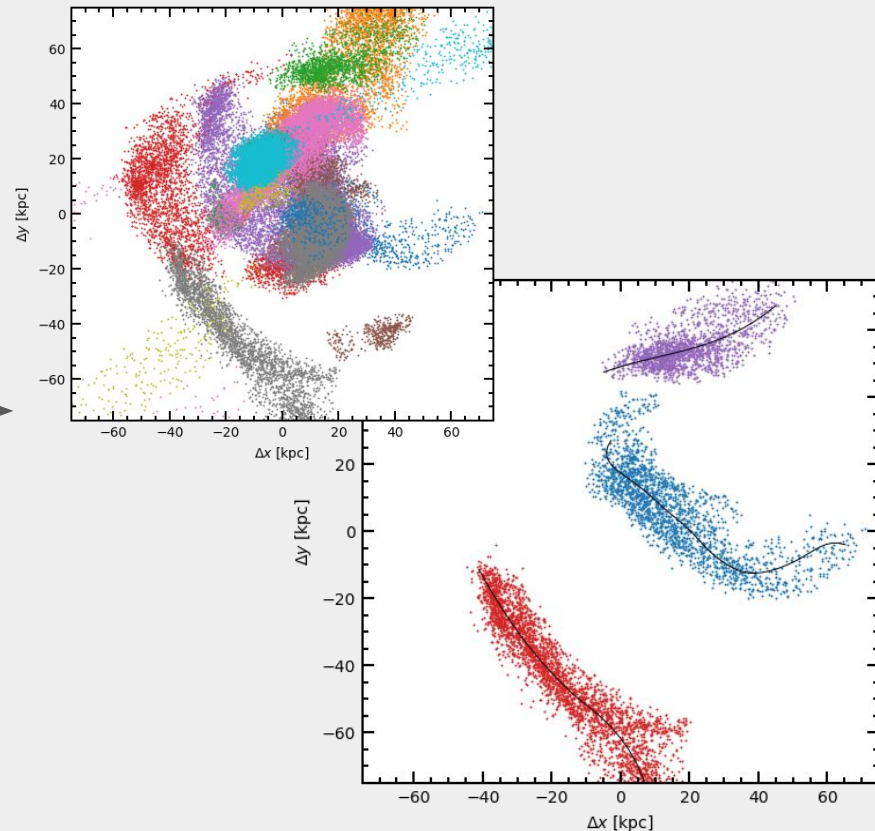


# Future work: automatic identification and measurement of tidal features

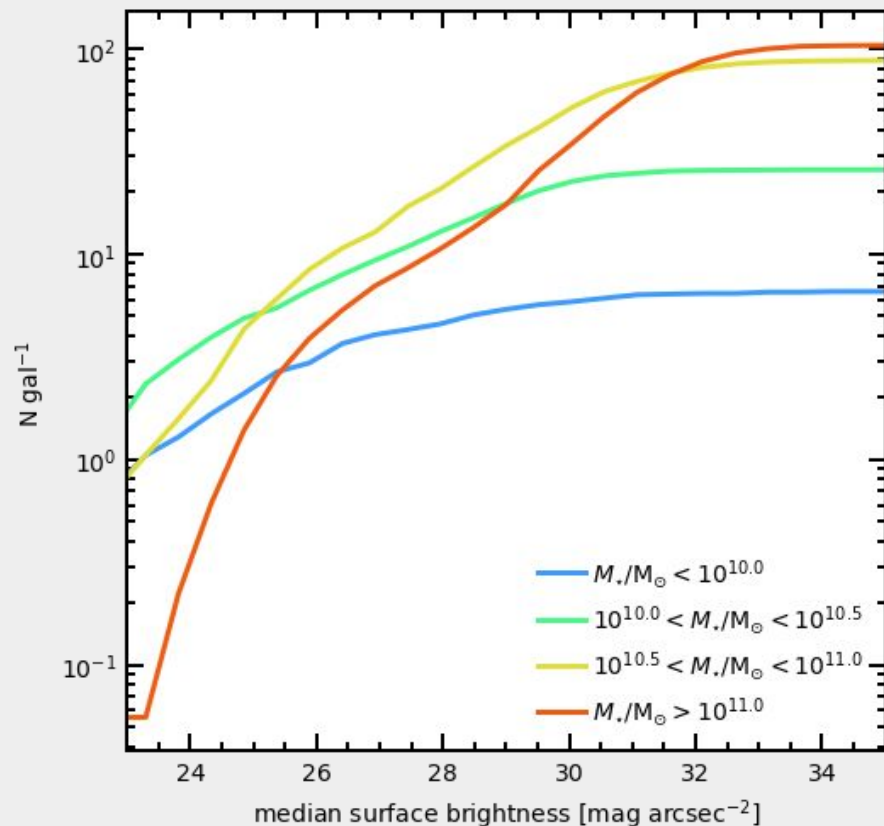
6-D Kinematically coherent features identified using clustering hierarchical density-based clustering (HDBSCAN, [McInnes+2017](#))



Measure properties of individual tidal features along the medial spine of each tidal feature



## Future work: automatic identification and measurement of tidal features



- We can then measure the distribution of tidal feature properties from the simulation
- And use as a ground truth to compare with human classifications
- Use the statistical and dynamical properties of tidal tails and streams to construct a more realistic test of cosmological models (e.g. [Mihos+98](#)/[Dubinski+99](#), [Bonaca+19](#), [Ren+20](#))

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## Future work

- Directly compare automated measurements of simulated tidal features with human classifications
- Expected frequency and distribution of tidal features as a function of surface brightness
- Expected distribution of tidal feature properties – length, curvature, colour etc.
- Statistical properties of tidal tails can provide a possible test of cosmological models (e.g. [Ren+2020](#))

**MNRAS, 513, 1, pp.1459-1487, arXiv:2203.07675**

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