



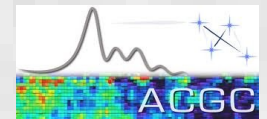
WISE as the cornerstone for all-sky photometric redshift samples

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+ *Polish WISE team: **Kasia Małek**, M. Krupa, A. Kurcz,*
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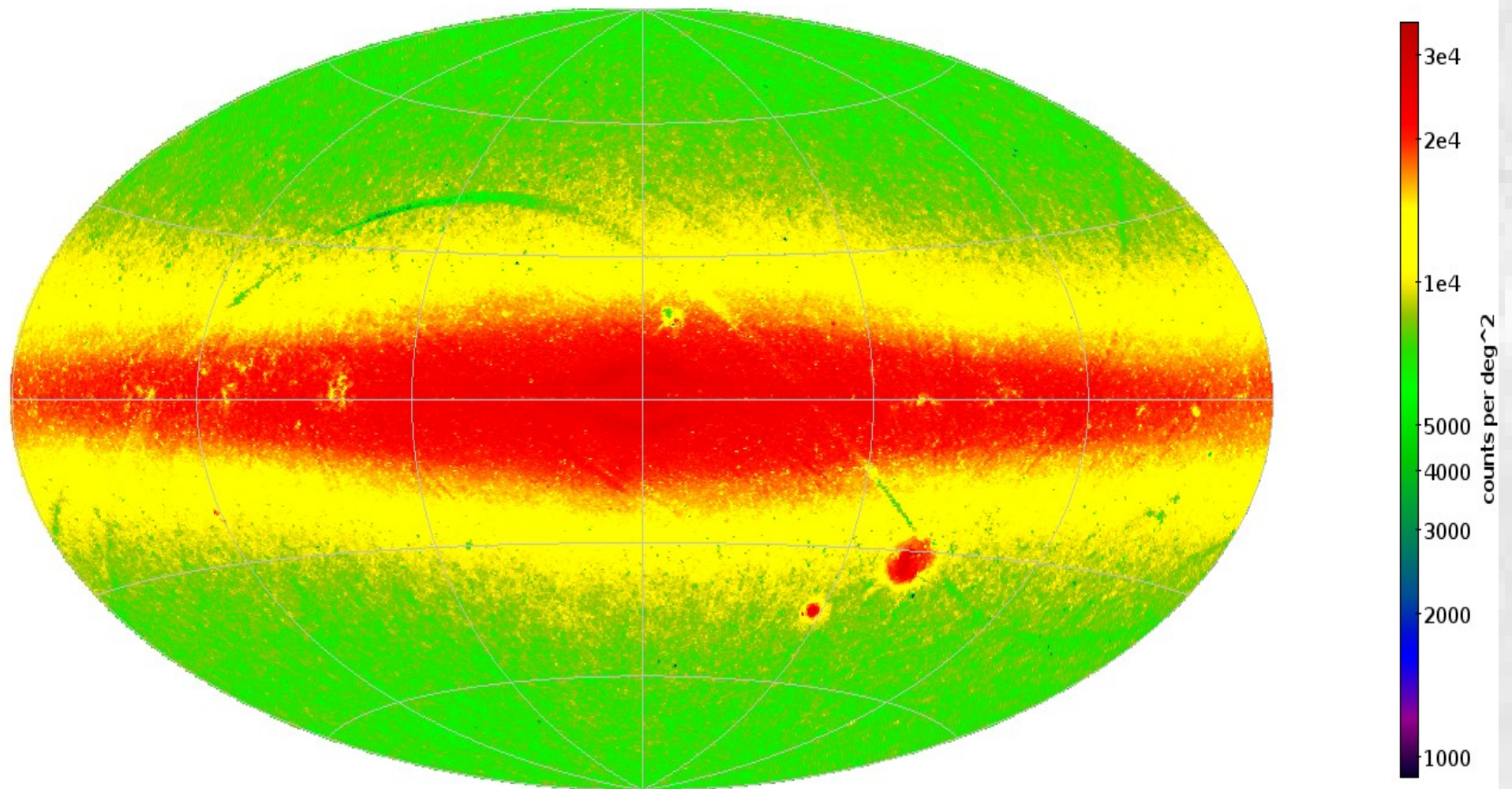
NARODOWE CENTRUM NAUKI



National
Research
Foundation

AllWISE W1 < 17

488 million sources

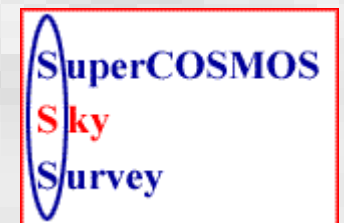


The need for all-sky galaxy surveys in three dimensions

- To obtain a **complete picture of the Universe** we ideally need to observe the **entire sky** ($=4\pi$ steradians), in 3 dimensions and deep
- **Early Universe** very **homogeneous and isotropic**; but what about today? (the **Copernican Principle** needs to be studied *observationally*)
- Related **cosmological tests** require observing the whole celestial sphere in 3D:
 - Are the **CMB anomalies** confirmed as today's anisotropy and/or inhomogeneity?
 - How large are the **bulk flows** of galaxies? Are they in conflict with the CP?
 - What structures **pull the Local Group** of galaxies?
- Other probes - e.g. the **integrated Sachs-Wolfe** effect, **CMB lensing on LSS** or **baryon acoustic oscillations** - also need surveys of large coverage and volume

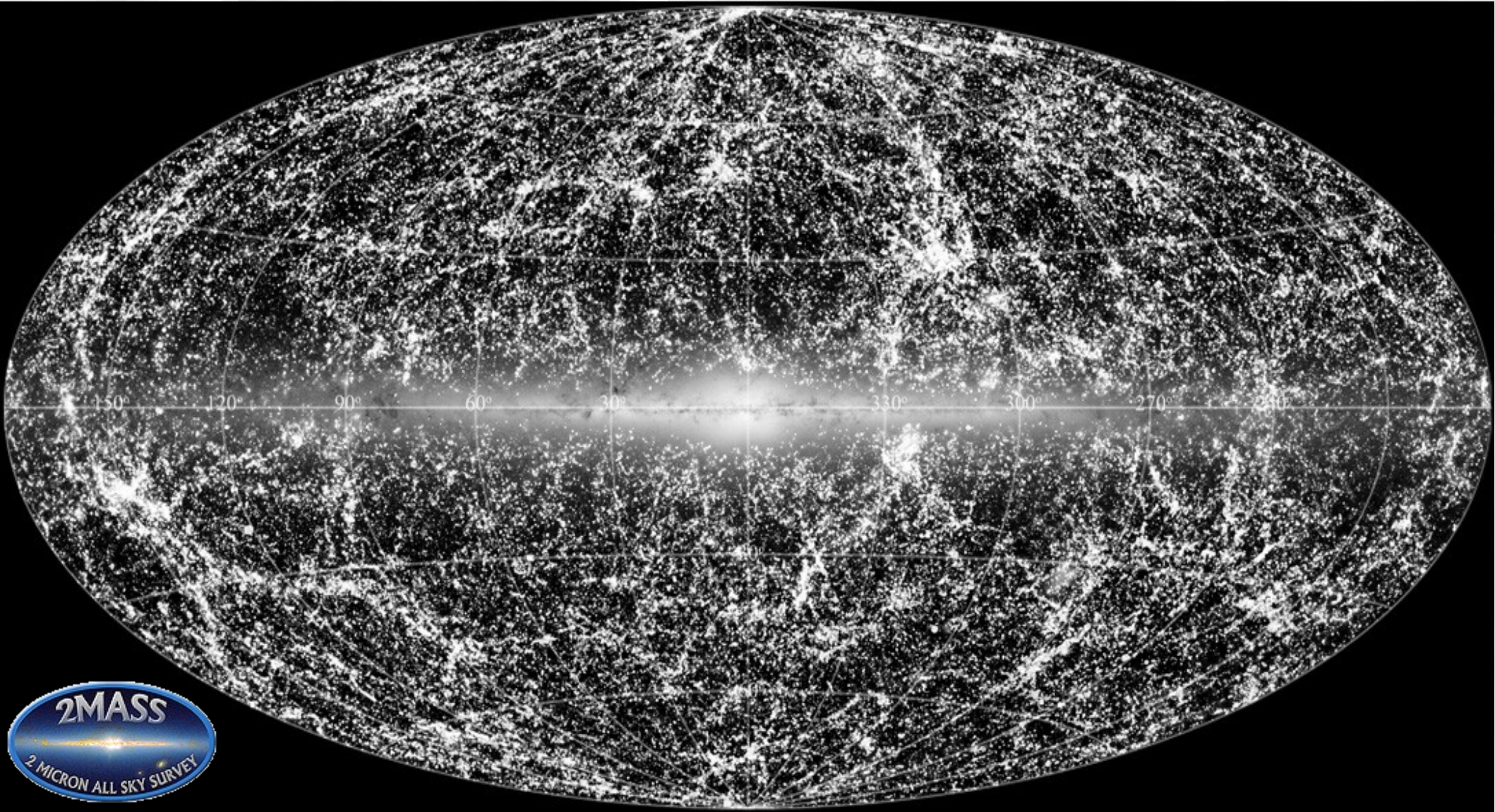
State of the art in all-sky (3D) galaxy surveys (before our efforts)

- The **largest all-sky catalog of extended sources** (galaxies):
the Two Micron All Sky Survey (**2MASS XSC**, Jarrett et al. 2000)
1 million galaxies, complete up to $K_s = 13.9$ mag ($z \sim 0.1$)
- 2MASS Redshift Survey of *44,000 galaxies* (**2MRS**, Huchra et al. 2012):
complete all-sky redshift coverage, but only at $\langle z \rangle = 0.03$
- Going deeper with spectroscopic redshifts for 2MASS sources:
the **2M++ compilation** by Lavaux & Hudson, 70,000 2MASS galaxies
- '**WISE XSC**' is still to be made (Jarrett, Magoulas, Cluver et al.)
[but see the **WNGA** poster by Seibert & Neill on the largest WISE galaxies]
- Legacy: **SuperCOSMOS** catalog of all-sky photographic data,
digitized and calibrated in Edinburgh (Hambly et al. 2001)
- See also the poster by Andras Kovacs on **WISE x 2MASS PSC**
galaxy sample



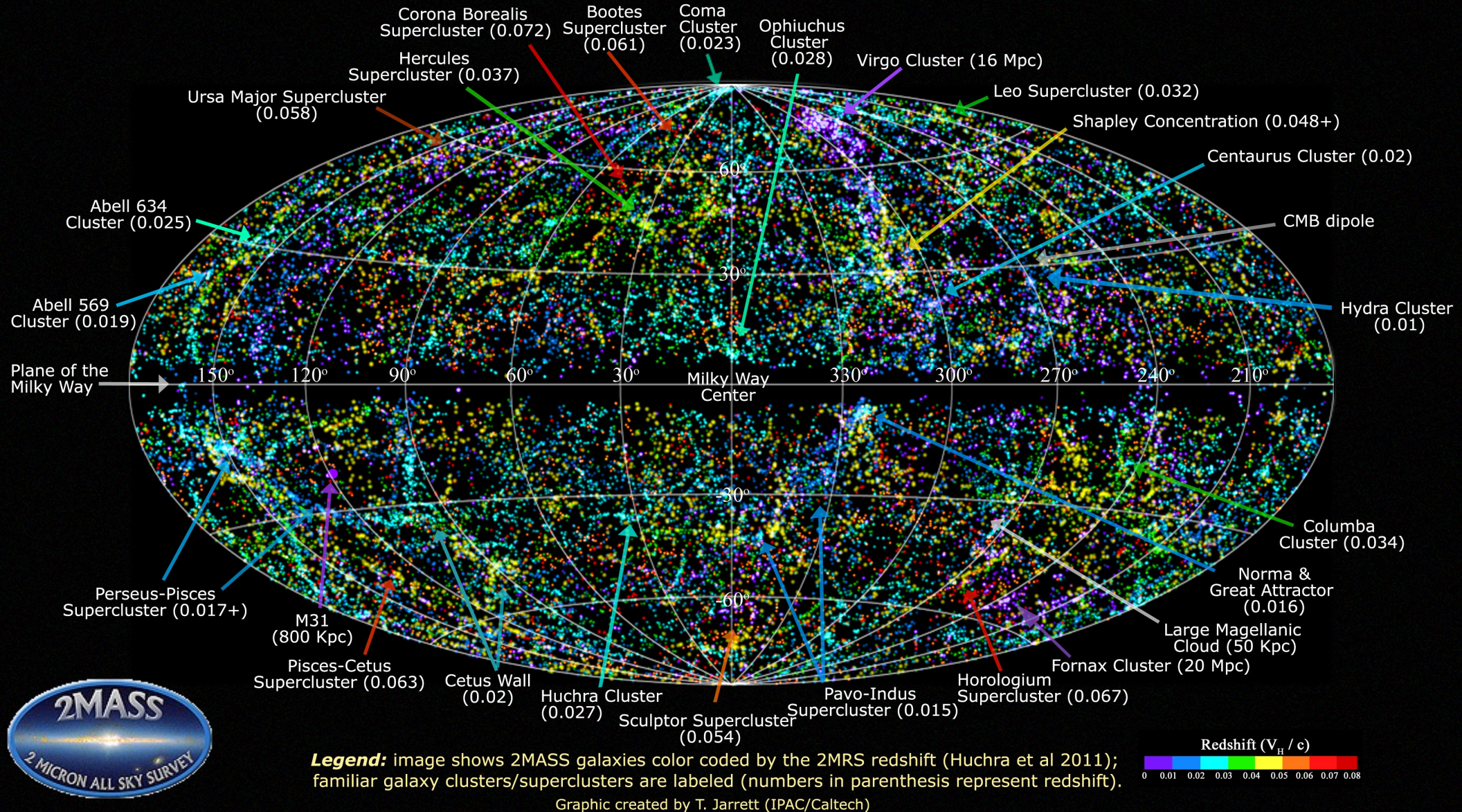
The largest all-sky catalogs of galaxies

Photometric: 2MASS XSC of 1 million galaxies



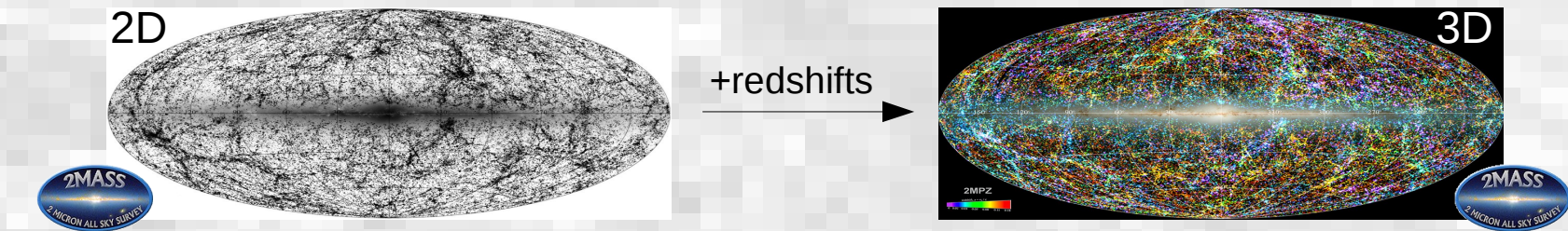
The largest all-sky catalogs of galaxies

Spectroscopic: 2MASS Redshift Survey of 44,000 galaxies



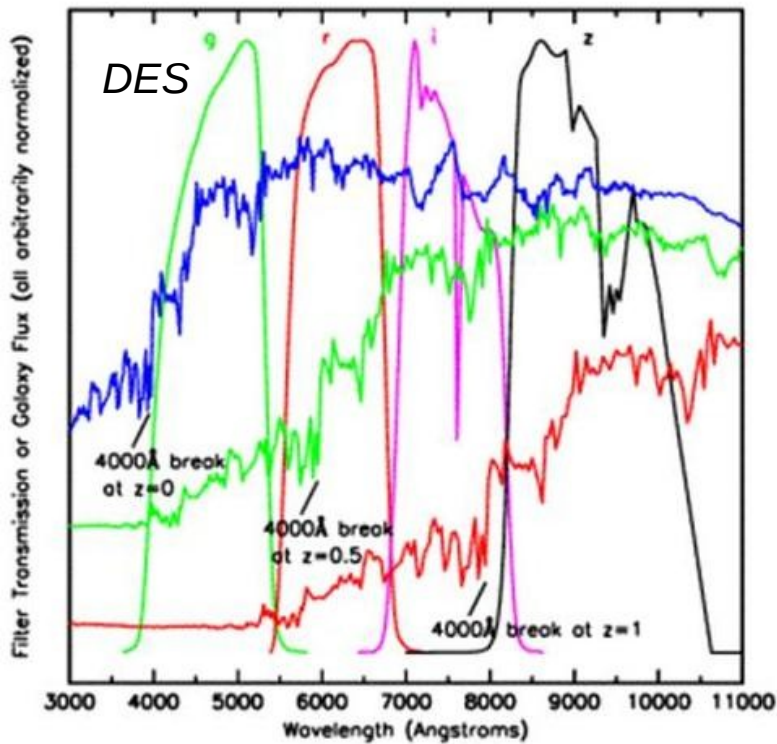
Huchra et al. 2012 (plot by Tom Jarrett)

Towards larger all-sky 3D catalogs



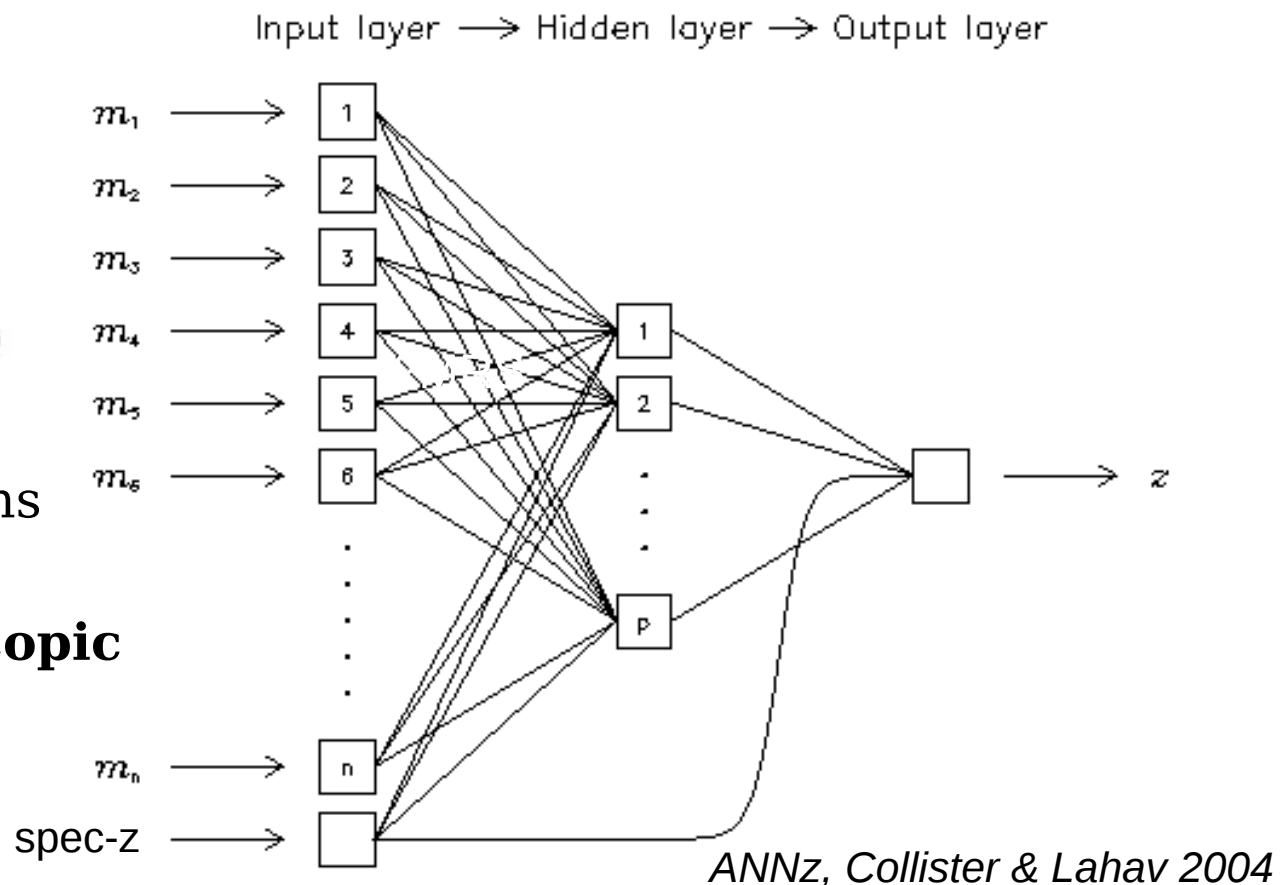
- **One third** of all 2MASS galaxies have **spectroscopic redshifts** from large surveys: **2MRS**, **2dFGRS**, **6dFGS** and **SDSS**
- **Not much hope** for supplementing the remaining 2/3 with **spec-z soon** (note however the **SPHEREx** proposal by Doré et al. arXiv:1412.4872)
- Adding the *third dimension* to the 2MASS XSC sample, an economic approach: **photometric redshifts** using appropriate z_{spec} calibration
- **Early attempts** for 2MASS by **Jarrett 2004** (2MASS only), **Francis & Peacock 2010** (2MASS x SuperCOSMOS) – before the advent of WISE
- **Precise 2MASS photo-z's** now possible thanks to adding WISE W1 & W2

Photometric redshifts via neural networks



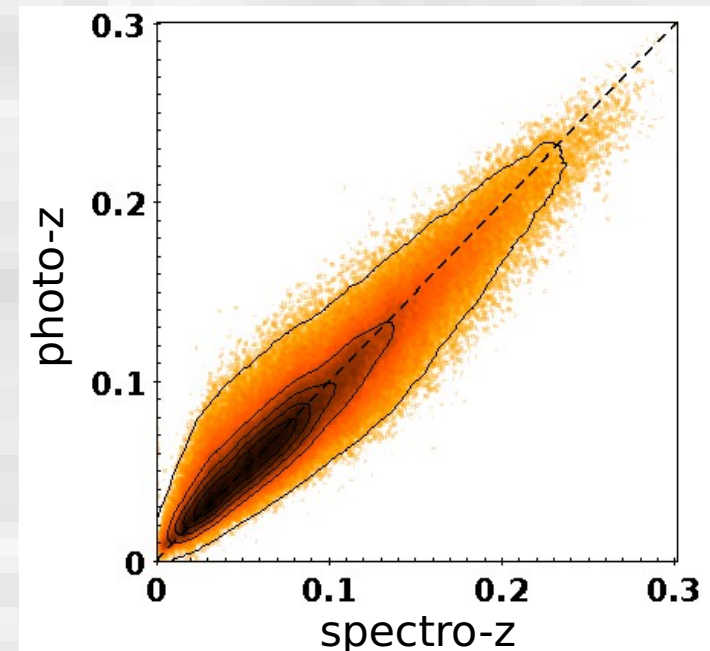
- Cosmological **shift** of **lines** and of **continuum** + **decrease** in bolometric **flux** + **evolution** = wavelength-dependent **magnitude changes**

- **Machine learning** algorithms (such as **neural networks**) can be **trained** on **spectroscopic** data to derive best-fit **photo-z's** for a given set of passbands



2MASS Photometric Redshift catalog (2MPZ)

- We cross-matched **2MASS XSC** (J H K_s) with **WISE** All-Sky (W1 and W2) and **SuperCOSMOS** (photographic B R I)
- We applied the **ANNz** (*Artificial Neural Networks*, Collister & Lahav 2004), trained on a representative spectroscopic subsample of 350,000 galaxies
- **2MPZ catalog of 1 million galaxies**, $\langle z \rangle = 0.08$, covering **most of the sky**
- Some statistics of the photo-z estimates:
 - 1-sigma scatter $\sigma_{\Delta z} = 0.015$
 - median error $|\Delta z|/z = 13\%$
 - only **3% of outliers** $> 3\sigma_{\delta z}$
- 2MPZ is **available for download** from the Wide Field Astronomy Unit at the Institute for Astronomy, Edinburgh:
<http://surveys.roe.ac.uk/ssa/TWOMPZ>



MB, Jarrett, Peacock, Cluver & Steward, ApJS, 210, 9 (2014), arXiv:1311.5246

2MASS Photometric Redshift catalog

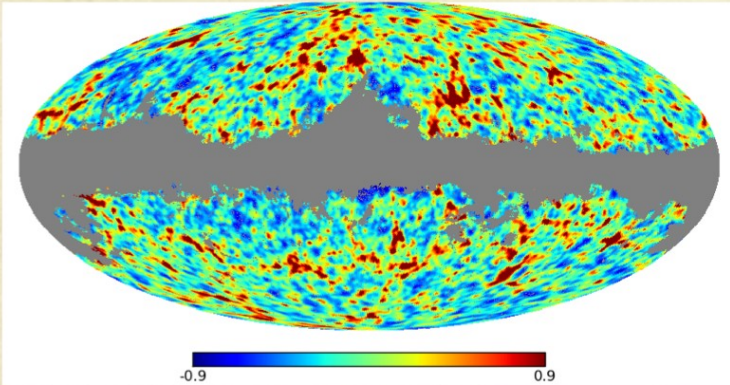
1 million galaxies in 3D

Color-coded by photometric redshifts

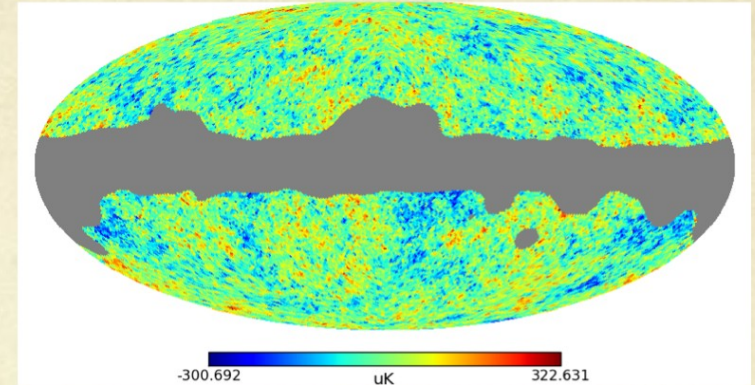
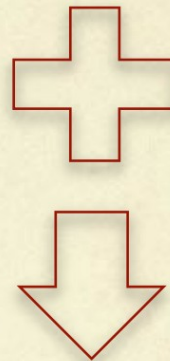


Plot by Tom Jarrett

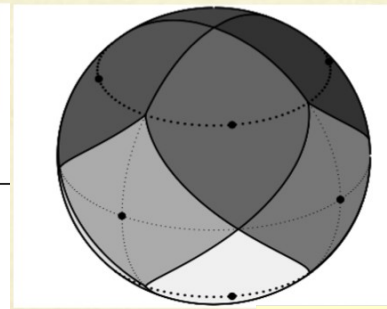
First cosmological results from 2MPZ: integrated Sachs-Wolfe tomography effort led by Louise Steward (UCT)



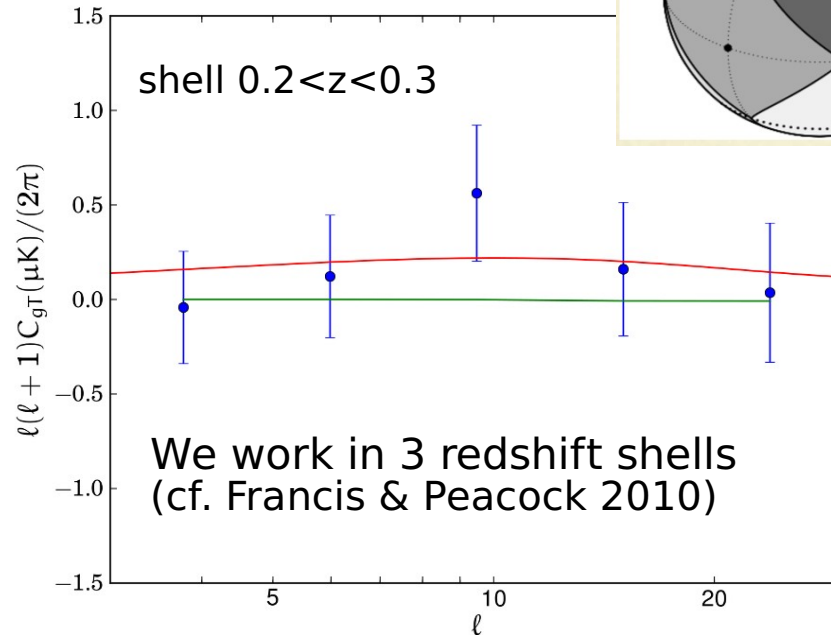
2MPZ galaxy distribution
in redshift shells



Planck temperature map



Cross-correlation



ISW signal and its significance

- We see **mild preference for ISW**:
less than 2σ , odds $\sim 3.5 : 1$ over no ISW
(cf. odds $1.5 : 1$ in Francis & Peacock '10)
- Good **photo-z's help**, but **2MASS** is **too shallow** even if it was fully spectroscopic

Steward, MB, et al. in prep.

$$C_{gT} =$$

Some other applications of the 2MASS Photo-Z catalog

- **Testing Isotropy in the Local Universe** (Appleby & Shafieloo, arXiv:1405.4595)
- **Identifying galaxy clusters** (Xu, Wen & Han, arXiv:1406.0943)
- **Looking for the transition to homogeneity** (Alonso et al., arXiv:1412.5151)
- **Integrated Sachs-Wolfe effect reconstruction** by the Planck team (Planck 2015 XXI, arXiv:1502.01595)

In preparation:

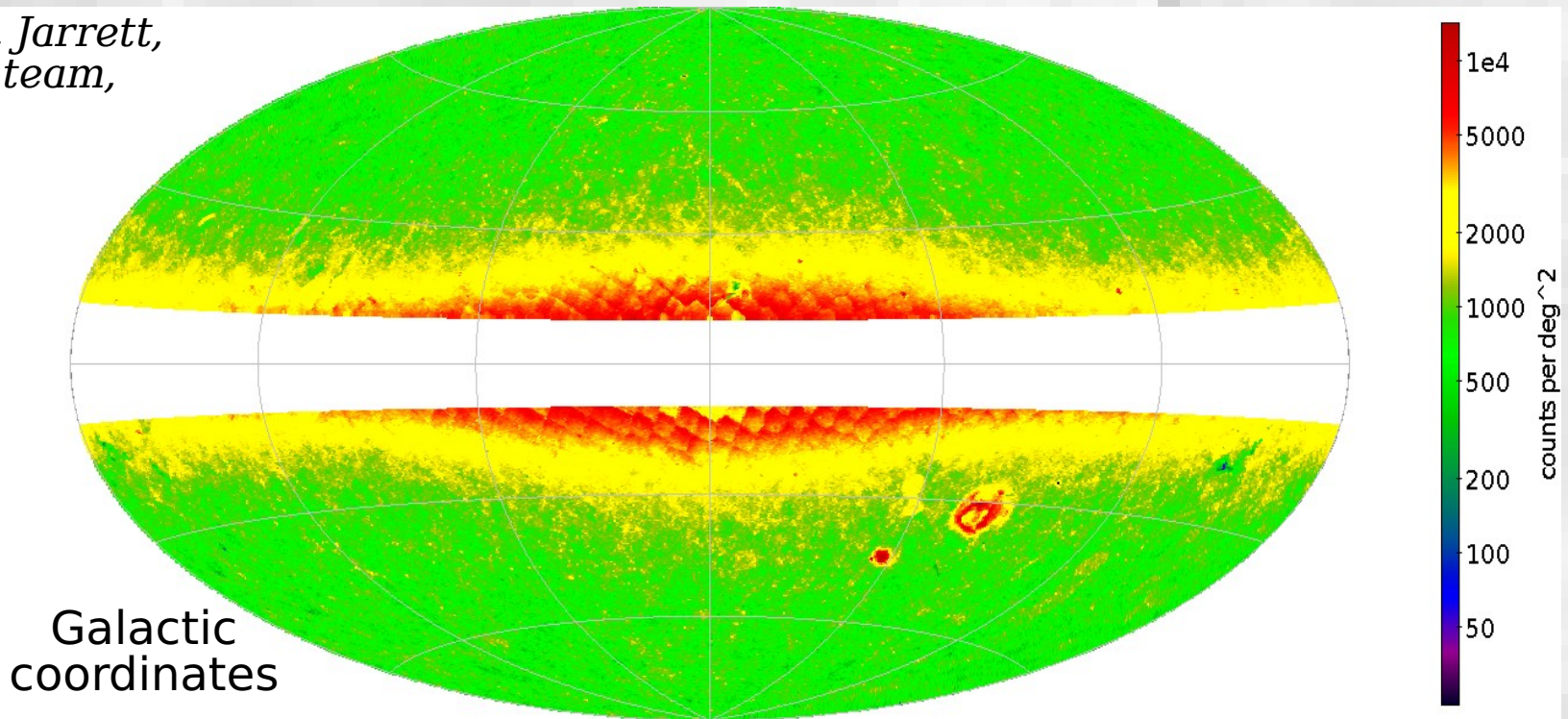
- **Local bulk flow** from luminosity function variations (Feix, MB, Nusser)
- **Cross-correlation with Fermi-LAT** gamma ray data for dark matter constraints (Cuoco, Branchini, MB)
- **Acceleration of the Local Group:** sources of the pull, **convergence?** (revisiting Erdogdu et al. 2006 & Bilicki et al. 2011) – PhD project of M Krupa



Going deeper than 2MASS over 75% of sky: WISE x SuperCOSMOS

- **All-sky photometric samples much deeper than 2MASS:**
WISE ($W1_{\text{Vega}} < 17$) and **SuperCOSMOS** ($R_{\text{AB}} < 19.5$ & $B_{\text{AB}} < 21$)
- **Preselections** for a reliable **galaxy sample**:
 $|b| > 10^\circ$; detected in W1 & W2; extended in SuperCOSMOS, detected in B & R
- Cross-match gives **47 million sources**, but mostly stars (blends)

*MB, Peacock, Jarrett,
& the GAMA team,
2015 in prep.*





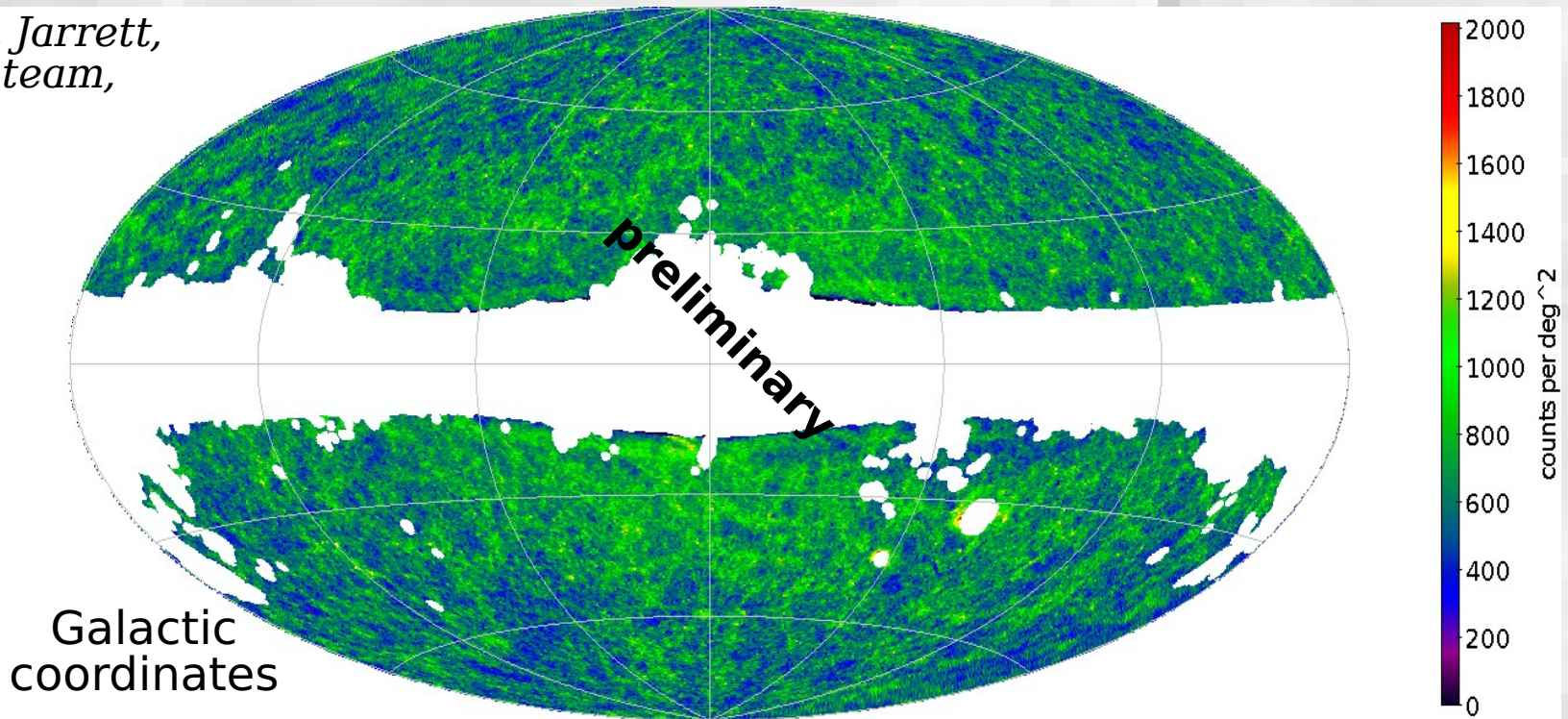
20 million galaxies from WISE x SuperCOSMOS



- A color-based clean-up of stars and QSOs/AGNs gives **20 million galaxies**
- Star removal through a **position-dependent W1-W2 cut** for all-sky uniformity
- Quasar removal uses **all-sky availability of R-W2 & W1-W2** information
- Being refined with **automatic classification (Kasia Malek's talk)**
- Sample now used for **preselection** in a new hemispherical **TAIPAN** spec-z survey



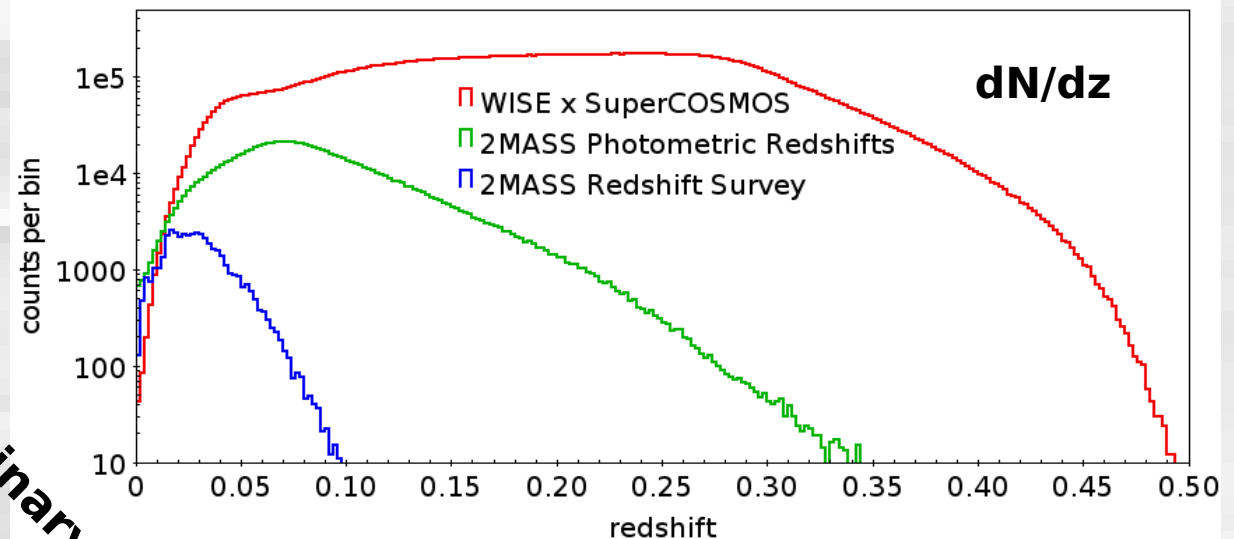
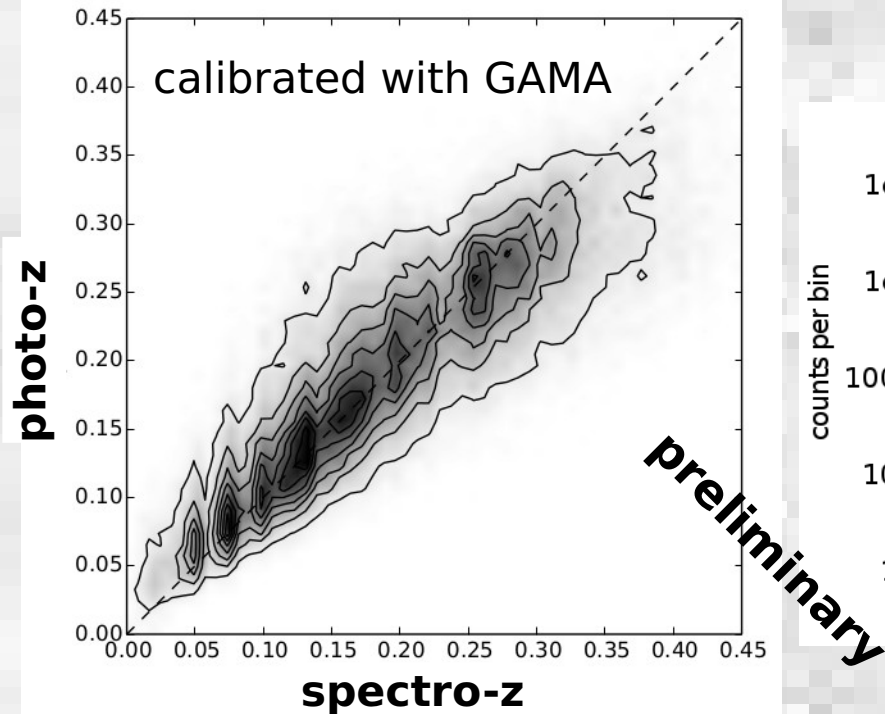
*MB, Peacock, Jarrett,
& the GAMA team,
2015 in prep.*





The largest ~all-sky 3D sample

- **WISE x SuperCOSMOS photo-z catalog:** much deeper than 2MASS
- **Four photometric bands** for photo-z's: optical **B,R**, infrared **W1,W2**
- Training sets: **GAMA** most recent data and **SDSS DR10**
- Median redshift **$z \sim 0.2$** , but probes the LSS reliably **to $z \sim 0.4$**
- Photo-z performance: $\sigma_{\Delta z} = 0.03$, median **error 14%** and **3% outliers**



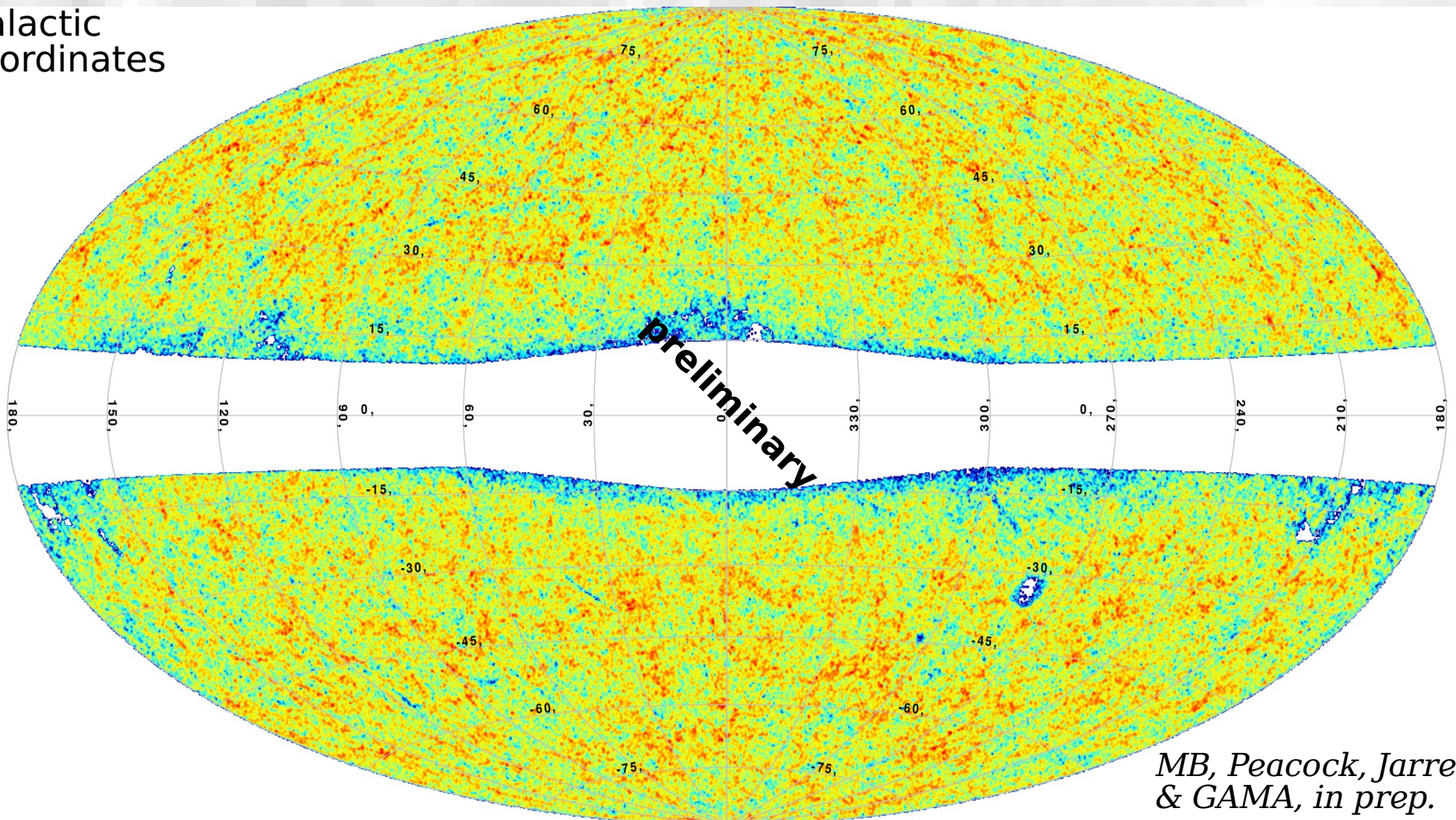
The cosmic web 2.5 Gyr ago

large-scale structure at $z \sim 0.2$

shell of $0.19 < z_{\text{phot}} < 0.21$

1.7 million galaxies

Galactic
coordinates



*MB, Peacock, Jarrett
& GAMA, in prep.*

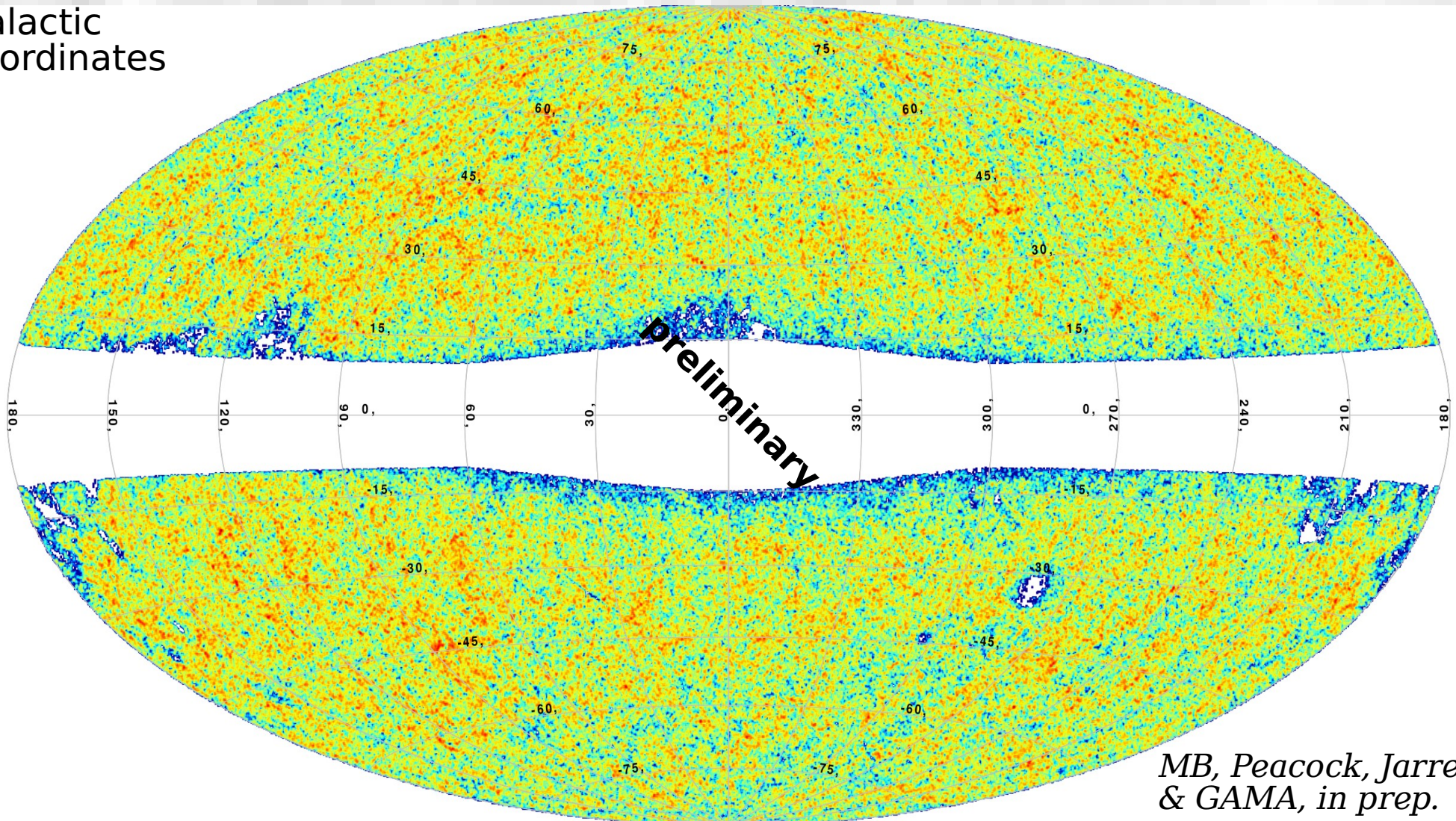
The cosmic web 3.5 Gyr ago

large-scale structure at $z \sim 0.3$

shell of $0.29 < z_{\text{phot}} < 0.31$

1.2 million galaxies

Galactic
coordinates



Possible cosmological applications of the WISE x SuperCOSMOS photo-z catalog

Similar as for the 2MPZ but on scales ~ 3 times larger:

- **Testing isotropy and homogeneity** of the Universe up to $z \sim 0.4$
- **Integrated Sachs-Wolfe** tomography with a hope for a decent S/N
- **Largest-scale bulk flow** studies with the luminosity function
- **Identifying galaxy clusters** – low- z supplement to MADCOWS (+photo- z 's!)
- **Pull on the Local Group of galaxies** from scales > 500 Mpc/h?

Not practicable so far with all-sky data (such as 2MASS):

- **Cross-correlation with CMB lensing** – Peacock & Bilicki in prep.
- **Angular BAO tomography** – cf. DES science case
- **Certainly many more** (a large **AGN/QSO population** – K. Małek's talk)

All-sky probes: time for

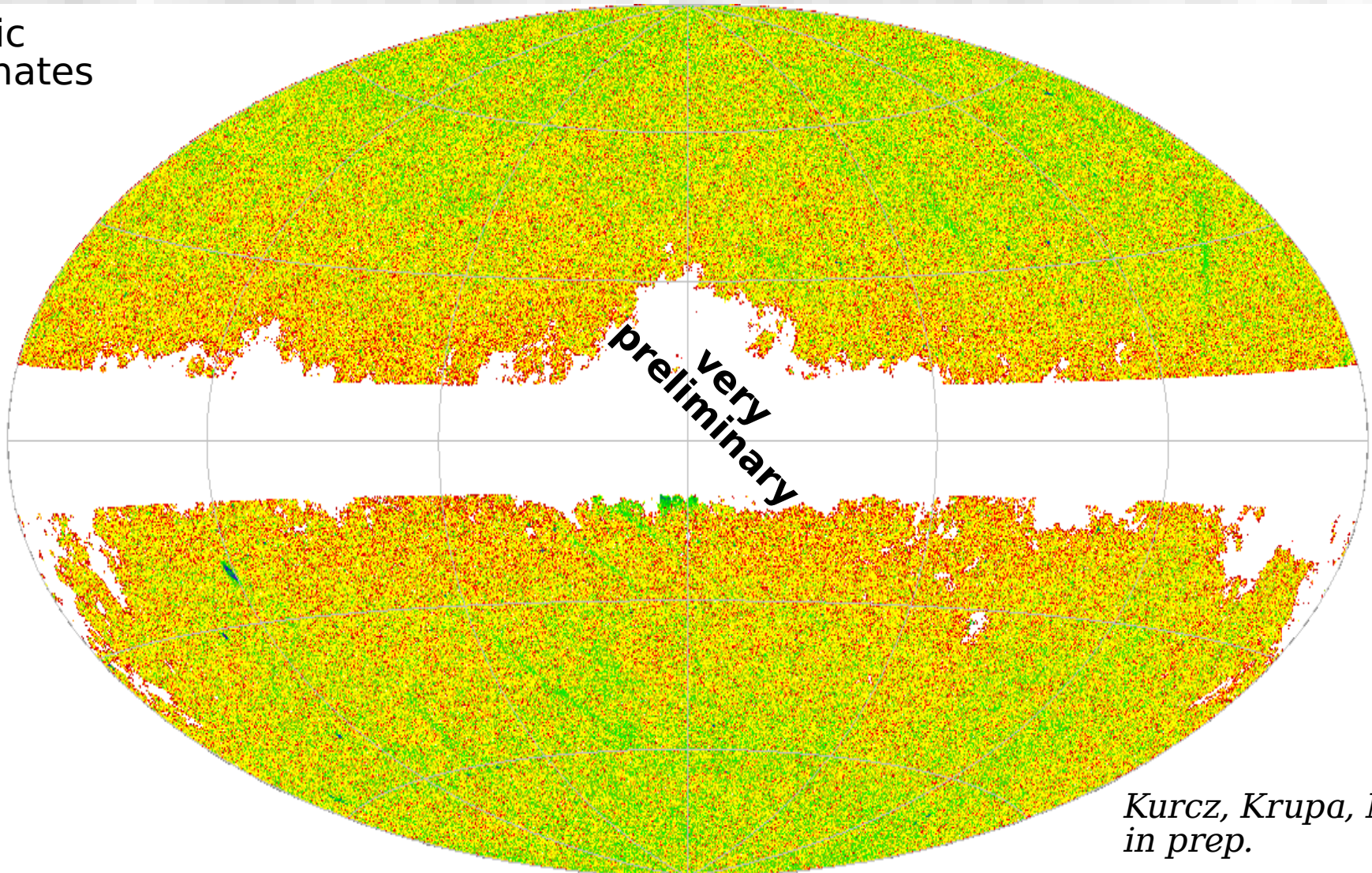


- **One of the largest all-sky samples:** over **700 million** sources in AllWISE
- **WISE** itself is **much deeper** (~ 3 mag) **than 2MASS** as well as **than SuperCOSMOS:** another “layer” for extragalactic science
- Ongoing work at the University of Cape Town (Jarrett, Magoulas, Cluver): **large-scale structure** as seen by WISE (deep) in Galactic Caps ($|b| > 60$)
- Full **cosmological potential of WISE** still to be explored: dominated by stars even at relatively high latitudes
- Of particular interest: **quasars** available **all-sky** for the first time
- In the queue: automatic **star-galaxy-QSO separation** in WISE only (MB & Polish WISE team: Kurcz et al. in prep.)
- Preliminary classification results: at $W1 < 16$ & $|b| > 10$, we provisionally identify **~ 80 mln galaxies, 70 mln stars and 2 mln QSOs**

Very preliminary:

~2 million WISE AGNs/QSOs at $W1 < 16$

Galactic
coordinates



*Kurcz, Krupa, MB et al.
in prep.*



Summary

- **We now have access to the largest volumes on $>3\pi$ steradians of the sky**
- **Third dimension at these scales possible (only) with photometric redshifts**
- **New galaxy catalogs (2MPZ, WISE x SuperCOSMOS) now probe up to $z\sim 0.4$**
- **WISE is the crucial ingredient in the recipes for these catalogs**
- **2MPZ publicly available from <http://surveys.roe.ac.uk/ssa/TWOMPZ>**
- **Stay tuned for more: WISExSCOS photo-z's, ~all-sky classification, ...**