



# THE LARGEST X-RAY SURVEY

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PHOTOMETRIC REDSHIFTS (AND SPECTRAL FITS) FOR THE 3XMM  
CATALOGUE - ESA PRODEX

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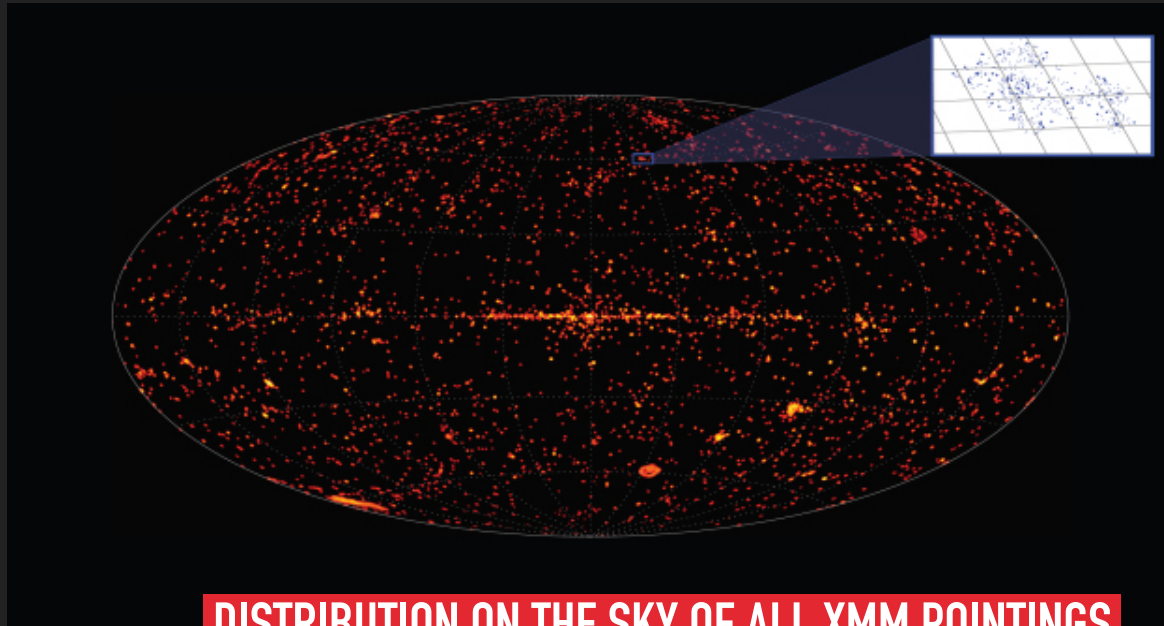
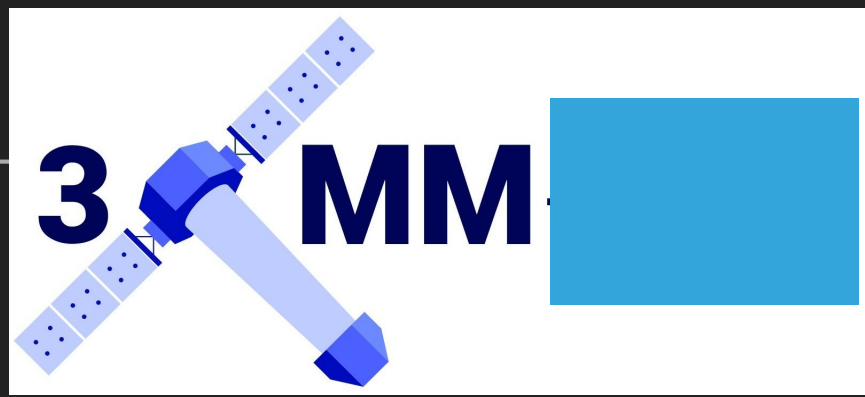
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# TALK OUTLINE

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- ▶ The scope of the project
- ▶ Brief Description of the 3 XMM - (DR7) catalogue
- ▶ comparison with other X-ray surveys (and eROSITA)
- ▶ Machine Learning Photometric redshifts (TPZ)
- ▶ Description of Optical/IR photometric catalogues used
- ▶ spectroscopic training samples
- ▶ scientific potential

# THE 3XMM CATALOGUE



**DISTRIBUTION ON THE SKY OF ALL XMM POINTINGS**

**median flux  $\sim 1e-14$  2-10 keV**

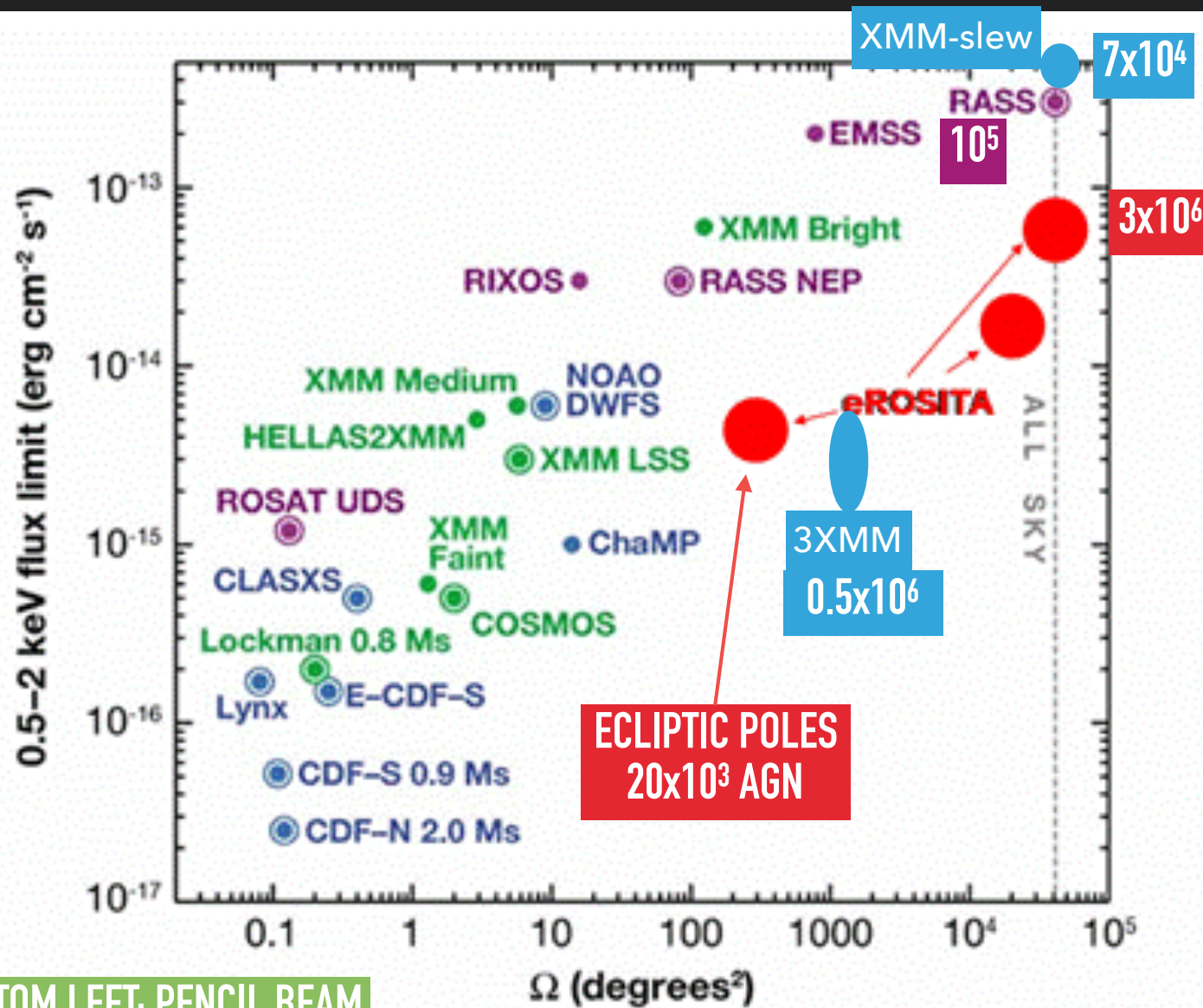
- ▶ ~2% of the sky or 1032 sq. degrees
- ▶ 10,000 pointings,
- ▶ 500,000 unique sources
- ▶ 170,000 sources with X-ray spectra

# XMM LARGE AREA SURVEYS

- ▶ COSMOS survey 2 sq. degrees 50ksec : 2000 sources
- ▶ XMM/ATLAS 7 sq. degrees 5 ksec : 2000 sources
- ▶ Stripe-82 32 sq. degrees :
- ▶ XMM/XXL 2 x 25 sq. degrees 10 ksec : 17,000 sources
- ▶ 3XMM ~1000 sq. degrees 500,000 sources

THE BACKGROUND IS THE XMM/ATLAS TRUE COLOUR 7 deg<sup>2</sup> MOSAIC IMAGE

# ATLAS OF X-RAY SURVEYS



TOP RIGHT: ALL-SKY SURVEYS

BOTTOM LEFT: PENCIL BEAM

DISTANCES (REDSHIFTS) ARE NECESSARY TO RELEASE THE POTENTIAL OF 3XMM AS A SURVEY TOOL

# PHOTOMETRIC REDSHIFT TECHNIQUES (FOR X-RAY SOURCES)

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■ Spectral Energy Distribution fitting (Salvato+, Hsu+ using LePhare) applied to e.g. COSMOS , CDFS

PLUS: no training sample necessary

MINUS: very careful source matching and photometry i.e. time consuming

■ Machine Learning (e.g. **TPZ**, Kind Carrasco+13, **Dameware**, Brescia+15, **AnnZ**, Collister+04 )

PLUS: photometry requirements not rigorous as long as training sample has identical photometry

MINUS: large training sets are required

**NO MACHINE LEARNING TECHNIQUES APPLIED TO X-RAY SOURCES BEFORE  
mainly because the training samples were scarce.**

**We use the TPZ Algorithm (Trees for photo-z , Kind Carrasco & Brunner 2013)**

# OPTICAL PHOTOMETRY

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- ▶ SDSS ( $\sim 10,000 \text{deg}^2$ )  $u, g, r, i, z$  ( $r_{AB} \sim 22.2$ )
- ▶ PANSTARRS ( $3\pi$ )  $g, r, i, z, Y$
- ▶ near-IR (VISTA, ukidss): J, H, K
- ▶ + UKIDSS J, H, K
- ▶ WISE (all-sky) : W1 ( $3.6 \mu\text{m}$ ), W2 ( $4.5 \mu\text{m}$ )
- ▶ **Future work will include deeper optical observations in KIDS (25)  $\text{deg}^2$  , SDSS Stripe-82 (30  $\text{deg}^2$ ) (and eventually DES 100  $\text{deg}^2$ ), with  $r \sim 24.5-25$**

# MATCHING BETWEEN X-RAY AND OPTICAL SOURCE CATALOGUES

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The XMATCH Bayesian matching tool (ARCHES EU FP7) between multiple catalogues (e.g. X-ray, optical, near-IR) assigning a probability for the multi-source match

This takes into account the catalogue positional error and the source density of the matching catalogues (for details see Pineau et al. 2016). WE KEEP ALL SOURCES  $P > 0.7$

This may be fine for the current optical depths probed but going deeper one needs to take into account the varying surface density with optical magnitude (e.g. NWAY, XMATCH upgrade).



# PANSTARRS

▶ PANSTARRS 95k (Gal. lat.  $|b| > 20$ )

▶ 65k with  $> 7$  bands

bands	No	Filters	+Filters
10	20103	grizY	JHKw1w2
8	5984	grizY	JHK
7	38949	grizY	w1w2
5	29117	grizY	

# STARS AGAINST GALAXIES

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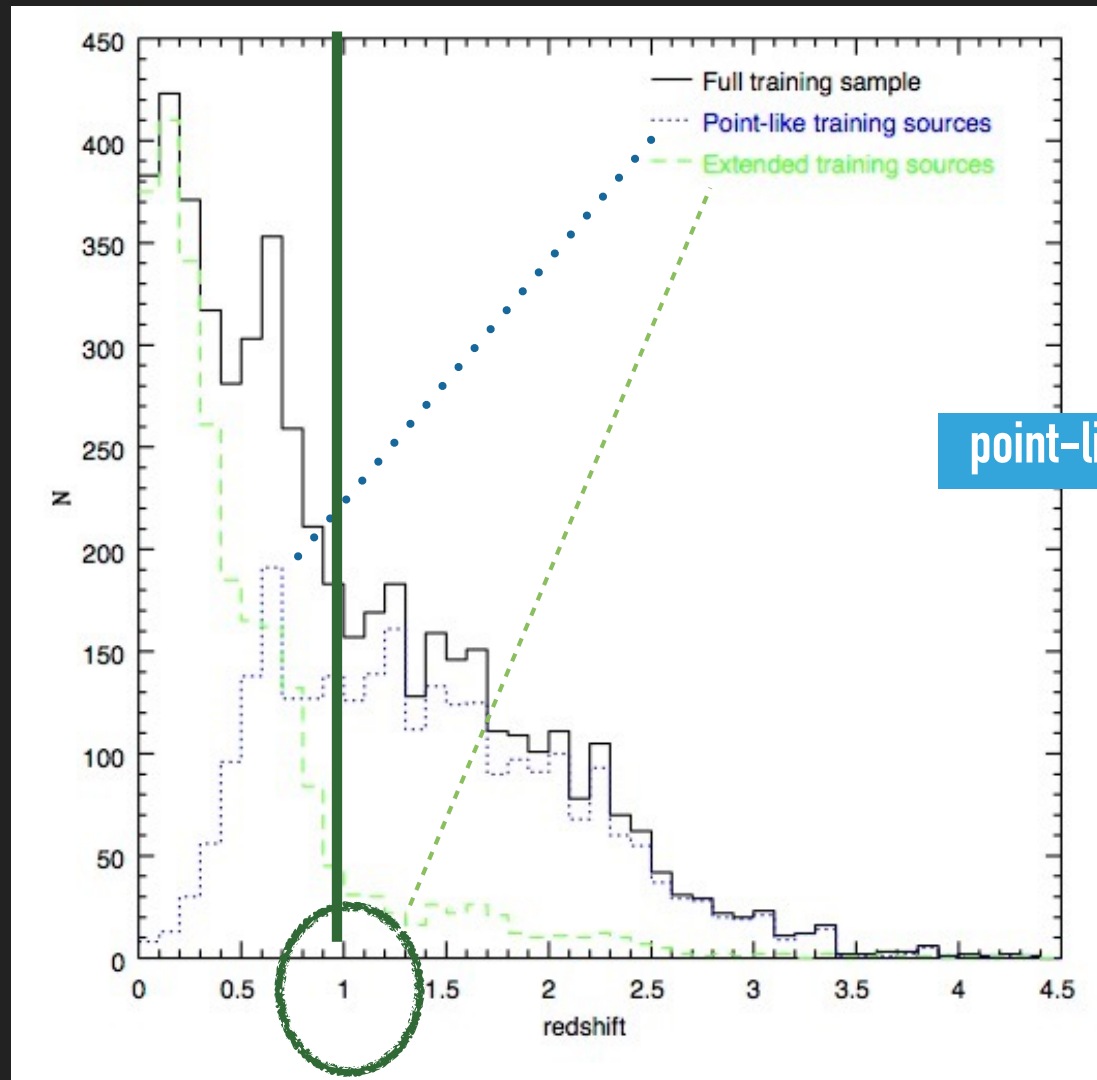
- ▶ Methods that could be employed:
  - ▶ 1. optical vs. near-IR colours
  - ▶ 2.  $F_x/F_{opt}$
  - ▶ 3. Proper motions (Tian+17) using GAIA

# TRAINING SAMPLE

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- ▶ XMM/XXL survey North 25deg2
- ▶ spectroscopic redshifts have been obtained with SDSS specifically for the X-ray sources
- ▶ 2512 AGN Menzel et al. 2016
- ▶ sample increased with XWAS (Esquej 2013), XBS (DellaCeca 2004), XMS (Barcons 2007), XMM-COSMOS (Brusa 2010) , optically selected X-ray AGN

# TRAINING: REDSHIFT DISTRIBUTION



point-like sources occupy higher redshifts

# PERFORMANCE SUMMARY

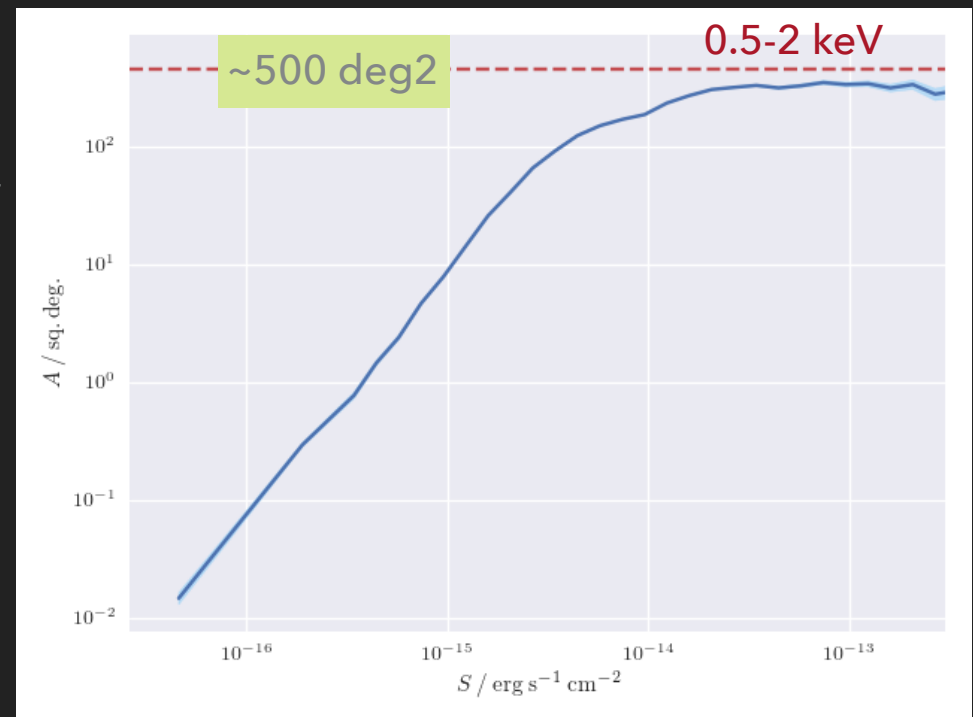
# bands	SDDS t.s.		Pan-STARRS t.s.	
	$\sigma_{\text{NMAD}}$	eta(%)	$\sigma_{\text{NMAD}}$	eta(%)
Point-like sources				
5	0.076	29	0.138	41
7	0.064	19	0.088	25
8	0.057	20	0.074	26
10	0.049	14	0.062	17
Extended sources				
5	0.071	18	0.063	13
7	0.057	14	0.038	6
8	0.054	12	0.052	9
10	0.046	9	0.036	4

- ▶ **Extended sources** behave better than point-like sources
  - ▶ **The more the bands the better**, both in number of outliers and  $\sigma$
  - ▶ These numbers can improve by applying a **cut in z-conf** (which is a measure of extent of the PDF). this cut at the cost of reducing the sample size of course
- OF COURSE THE KEY FOR THE PERFORMANCE IS THE TRAINING SAMPLE SIZE**

# AREA CURVES

## Indirect way: if we know the logN-logS we derive the area curve

- ▶ Based on the XMM/SDSS (120deg<sup>2</sup>) by Georgakakis 2011 where the logN-logS is well-known (unweighted flux distribution  $\times$  area curve = logN-logS)
- ▶ If the logN-logS is known, this implies that the area curve is well constrained
- ▶ However, stars should be first taken out
- ▶ (the Tian sample has not been used here)



# PHOT-Z ARE THE BASIS FOR OUR X-RAY SPECTRAL FITS

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- ▶ We use the (Bayesian) BXA software by Buchner et al.
- ▶ PYTHON scripts to perform Spectral fits using SHERPA
- ▶ Simple spectral models . The spectral parameters errors take into account the phot-z uncertainties as well

# SCIENCE : LUMINOSITY FUNCTION

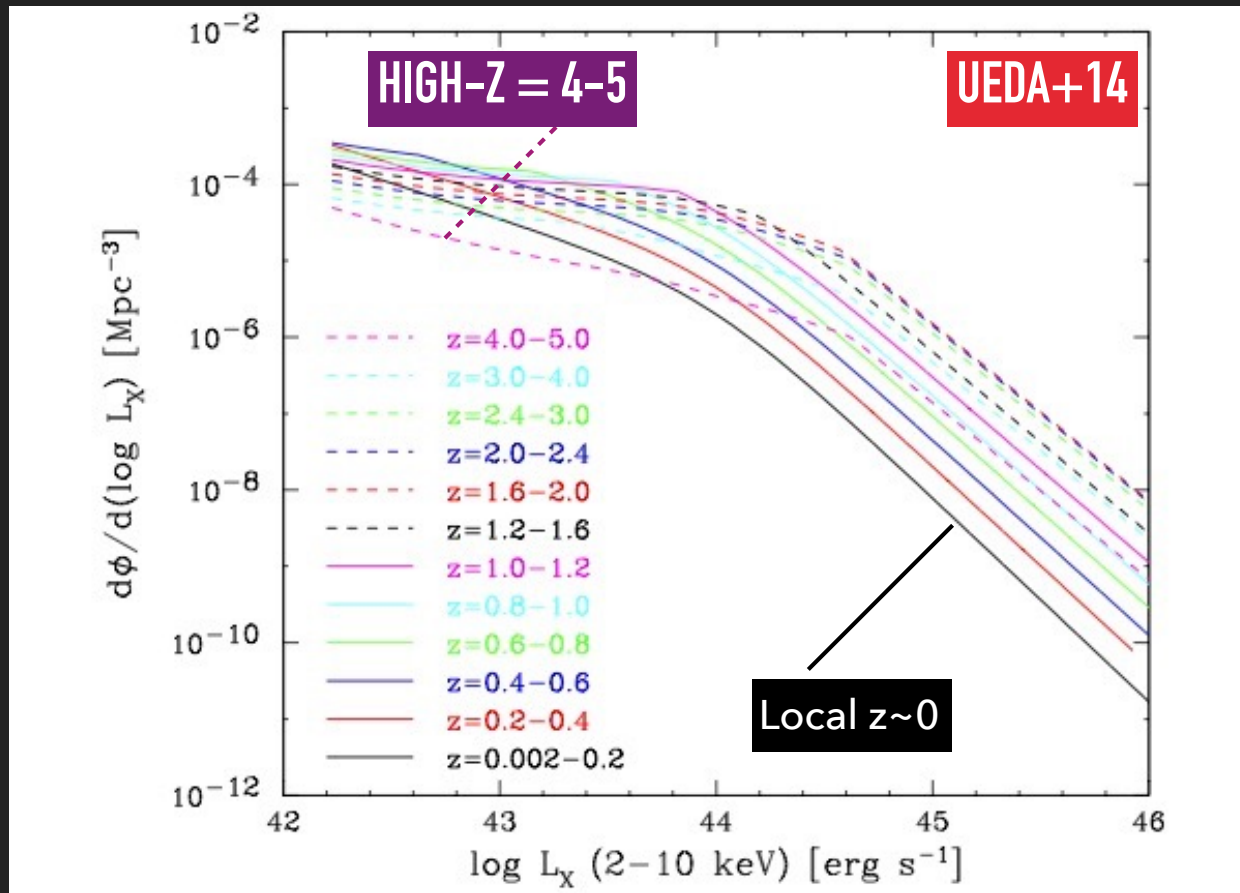
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- ▶ AGN Luminosity function (LF)
- ▶ Previous derivations examples include Ueda+14, Miyaji+15, Fotopoulou+16, Buchner+16, Ranalli+16, Aird+15 involving a few thousand sources



# X-RAY LUMINOSITY FUNCTION: WHAT WE LEARNED & OPEN QUESTIONS

- ▶ X-ray LF: double power-law, evolving with redshift

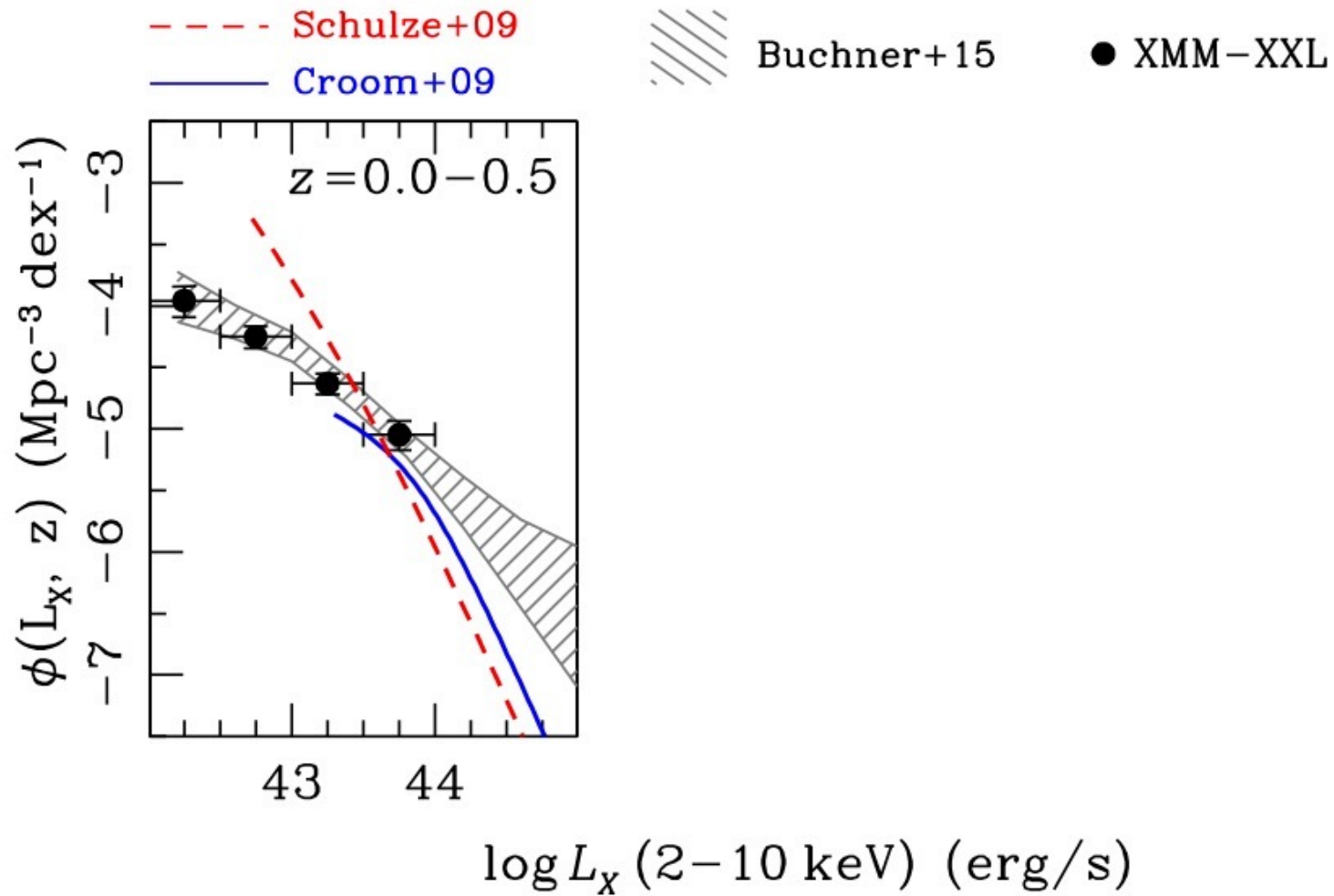


AGN WERE MORE LUMINOUS AND MORE NUMEROUS IN THE PAST

Now we can derive the LF with unprecedented detail as function of obscuration having numbers ( $\sim 100,000$ ) far exceeding the optical LF NUMBERS, SDSS/2QZ (Croom+09) based on 10,000 QSOs ( $0.4 < z < 2.2$ )

One major issue is that the optical and X-ray LF do not appear to evolve in the same way  
Pure Luminosity Evolution vs Luminosity Dependent Density Evolution

# OPTICAL VS. X-RAY LUMINOSITY FUNCTION

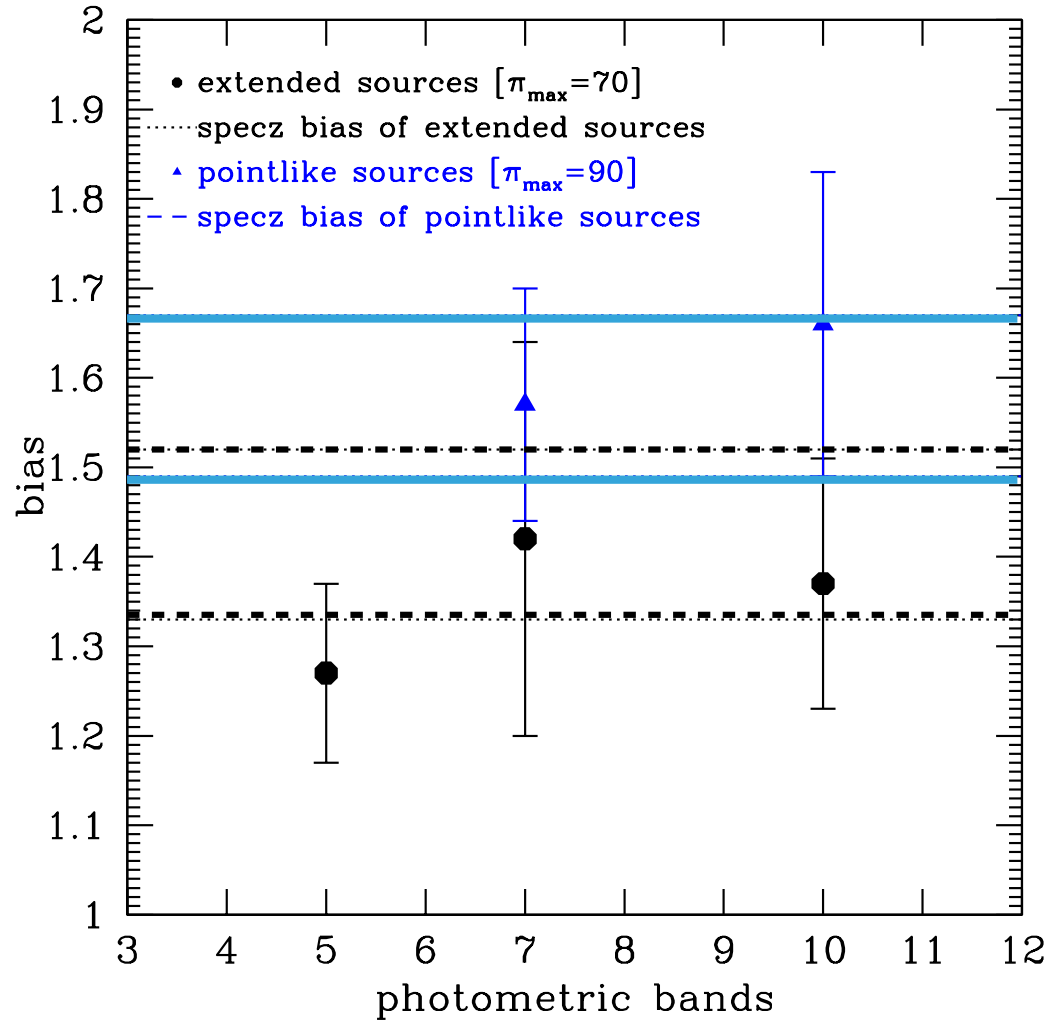


# COMPARISON BETWEEN SPEC AND PHOT-Z IN THE XMM/XXL NORTH

Points: 300 phot-z sources

Horizontal lines: same 300 sources, spec-z

(1- $\sigma$  uncertainty)



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<http://xraygroup.astro.noa.gr/Webpage-prodex/>

+ 3XMM WEB-PAGE IN IRAP

Mountrichas et al. 2017, A&A , 608, A39, for the application of TPZ in the XMM-ATLAS survey

Ruiz et al. A&A, submitted