# Quasi-stellar objects in the ALHAMBRA survey\*

# I. Photometric redshift accuracy based on 23 optical-NIR filter photometry

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Received 16 September 2011 / Accepted 7 February 2012

#### **ABSTRACT**

Context. Even the spectroscopic capabilities of today's ground and space-based observatories can not keep up with the enormous flow of detections (>10<sup>5</sup> deg<sup>-2</sup>) unveiled in modern cosmological surveys as: *i*) would be required enormous telescope time to perform the spectroscopic follow-ups and *ii*) spectra remain unattainable for the fainter detected population. In the past decade, the typical accuracy of photometric redshift (photo-z) determination has drastically improved. Nowdays, it has become a perfect complement to spectroscopy, closing the gap between photometric surveys and their spectroscopic follow-ups. The photo-z precision for active galactic nuclei (AGN) has always lagged behind that for the galaxy population owing to the lack of proper templates and their intrinsic variability.

Aims. Our goal is to characterize the ability of the Advanced Large, Homogeneous Area Medium-Band Redshift Astronomical (ALHAMBRA) survey in assigning accurate photo-z's to broad-line AGN (BLAGN) and quasi-stellar objects (QSOs) based on their ALHAMBRA very-low-resolution optical-near-infrared (NIR) spectroscopy. This will serve as a benchmark for any future compilation of ALHAMBRA selected QSOs and the basis for the statistical analysis required to derive luminosity functions up to  $z \sim 5$ .

*Methods.* We selected a sample of spectroscopically identified BLAGN and QSOs and used a library of templates (including the SEDs of AGN and both normal and starburst galaxies, as well as stars) to fit the 23 photometric data points provided by ALHAMBRA in the optical and NIR (20 medium-band optical filters plus the standard JHKs).

Results. We find that the ALHAMBRA photometry is able to provide an accurate photo-z and spectral classification for ~88% of the 170 spectroscopically identified BLAGN/QSOs over 2.5 deg<sup>2</sup> in different areas of the survey and brighter than  $m_{678} = 23.5$  (equivalent to  $r_{\rm SLOAN} \sim 24.0$ ). The derived photo-z accuracy is below 1% and is comparable to the most recent results in other cosmological fields that use photometric information over a wider wavelength range. The fraction of outliers (~12%) is mainly caused by the larger photometric errors for the faintest sources and the intrinsic variability of the BLAGN/QSO population. A small fraction of outliers may have an incorrectly assigned spectroscopic redshift.

Conclusions. The definition of the ALHAMBRA survey in terms of the number of filters, filter properties, areal coverage, and depth is able to provide photometric redshifts for BLAGN/QSOs with a precision similar to any previous survey that makes use of mediumband optical photometry. In agreement with previous literature results, our analysis also reveals that, in the 0 < z < 4 redshift interval, very accurate photo-z can be obtained without the use of NIR broadband photometry at the expense of a slight increase in the outliers. The importance of NIR data is expected to increase at higher z (z > 4). These results are relevant for the design of future optical follow-ups of surveys containing a large fraction of BLAGN, such as many X–ray or radio surveys.

Key words. galaxies: active – cosmology: observations – quasars: general – galaxies: evolution – galaxies: distances and redshifts

#### 1. Introduction

The role of active galactic nuclei (AGN) in the formation of the early structures and their later evolution has been reviewed over the past 15 years, becoming a key ingredient of galaxy evolution

<sup>\*</sup> Based on observations collected at the German-Spanish Astronomical center, Calar Alto (Almeria, Spain), jointly operated by the Max-Planck-Institut für Astronomie at Heidelberg and the Instituto de Astrofísica de Andalucía (CSIC).

models (e.g. Cattaneo 2002; Menci et al. 2003; Croton et al. 2006; Hopkins et al. 2010, and references therein). Evidence shows that many, if not all, massive galaxies harbor supermassive black holes (SMBHs; e.g. Kormendy & Richstone 1995). The close interaction between the formation and growth of the SMBH and the evolution of its host galaxy were initially revealed by: i) the tight correlations between the masses of central SMBHs and the velocity dispersions and luminosities of the bulges of many galaxies (Tremaine et al. 2002); ii) the remarkable similarities in the redshift at which starburst and accretion activities ocurred and iii) the observation of the so-called downsizing effect not only for the galaxy population but also for AGN, i.e. the most massive galaxies appear to have assembled the majority of their stars earlier than lower mass galaxies (Cowie et al. 1996; Zheng et al. 2007), while the density of lowluminosity AGN peaks at lower z than the more powerful ones (e.g. Hasinger et al. 2008, and references therein). Therefore, the measure of the space density of AGN with cosmic time not only provides information about the relative importance of accretion activity to the global energy output in the universe but also places important constraints on early structure formation and galaxy evolution (e.g. Di Matteo et al. 2005; Hopkins et al. 2010).

Quasi-stellar objects (QSOs) are the members of the AGN family that have particularly high intrinsic luminosities allowing them to be detected at large distances and to provide unique inside into the early history of the AGN-host galaxy interaction. Moreover, QSOs are potential contributors to the ultraviolet (UV) ionizing background (Cowie et al. 2009) and have probably played a non-negligible role in the reionization of the universe (Fan et al. 2006; Wang et al. 2010).

The optical selection of QSOs has been performed mainly with follow-up spectroscopic observations of color-color selected candidates (e.g. SDSS, Richards et al. 2002; and 2dF, Croom et al. 2004). These observations use slitless or prism spectroscopic surveys and poorly efficient flux-limited spectroscopic surveys (e.g. VIMOS-VLT Deep Survey, Gavignaud et al. 2006; Bongiorno et al. 2007). A novel technique with respect to previous selection criteria was introduced by the CADIS (Meisenheimer et al. 1998) and COMBO-17 surveys (Wolf et al. 2003). These photometric surveys used several optical broadand medium-band filters to characterize the nature of the detected population and derive its photometric redshift (photo-z) via the spectral energy distributions (SEDs). The fluxes reached by the survey have allowed the study of the high-z QSO population, thus overcoming the problem of QSO incompleteness in the redshift interval  $2.2 \le z \le 3.6$  (Richards et al. 2002). This redshift range is important because it corresponds to the peak and the turnover of the observed QSO space density (e.g. Wolf et al. 2004).

Over the past decade, a clearer understanding of the QSO evolution has been achieved thanks to a more accurate characterization of their different SEDs, to a more precise treatment of their variability, and to a significant improvement in their photo-z determination. This advance has been encouraged by the conception of modern cosmological surveys and newly available spacebased observing facilities (e.g. HST, XMM-Newton, Chandra, Spitzer, and Herschel among others) that have been able to detect a large amount of sources ( $\geq 10^6$ ). In particular, when a given scientific goal does not require detailed knowledge of the spectral properties of individual objects, properly designed photometric surveys can provide a highly reliable photo-z and spectral classification for each source. These photo-z's are an essential complement to the usually small fraction of sources with spectroscopic redshifts in major extragalactic surveys and to more reliably

probe the fainter detected population, which is difficult to access using current ground-based spectroscopic observatories. In addition, photo-*z* are used to validate uncertain spectroscopic redshifts typically obtained for spectra of low signal-to-noise ratio (S/N) or limited wavelength coverage (e.g. Fernández-Soto et al. 2001). Several computational methods have been developed to derive photometric redshifts with increasingly high precision (*BPZ*, *HyperZ*, *LePhare*, *ZEBRA*, *AnnZ*, *EAzY*, among others). Only recently have photo-*z* for AGN (Salvato et al. 2009; Luo et al. 2010; Cardamone et al. 2010) reached accuracies similar to those computed for normal and starburst galaxies (~1–2%; e.g. Ilbert et al 2009). A description of the current state of the art photo-*z* computation as well as a detailed performance comparison of various photo-*z* codes was provided by Hildebrandt et al. (2010).

In this context, we present the analysis of photometric redshift solutions found for a population of spectroscopically identified QSOs using the optical and near-infrared (NIR) multiband catalog of the ALHAMBRA survey. The ALHAMBRA survey was designed with an optimal filter combination in order to provide one of the most homogeneous, large, deep, and accurate photometric surveys. Given the proposed depth of the ALHAMBRA filters of  $AB \sim 24.5-25$ , we expect to sample the whole QSO LF up to  $z \sim 4.2$  and up to  $z \sim 6$  for sources with  $M_B > -24.2$ . At the current stage, the survey has mapped  $\sim$ 2.5 deg<sup>2</sup> of the sky in seven different regions. The results presented here, and the comparison with existing data from other cosmological surveys, will prove the capabilities of the survey to derive accurate photometric redshifts for the BLAGN/OSO population. Furthermore, this test will potentially identify redshift ranges for which QSO photo-z estimation maybe unreliable or QSOs with atypical SEDs that would then be suitable for more detailed study.

This paper is structured as follows. In Sect. 2, we describe the current photometric catalog from the ALHAMBRA survey as well as the ancillary data available in each of the ALHAMBRA fields from other cosmological surveys. This section also introduces the QSO sample selection. The methodology followed during the photo-z determination is discussed in Sect. 3 while in Sect. 4 we quantify the precision of our photo-z estimates by comparing them with previous results for this type of sources. Finally, Sect. 5 discusses the implications of our results and planned future analysis. A detailed QSO catalog will be presented in a forthcoming paper. Throughout our analysis, we assume a  $\Lambda$ CDM cosmology with  $H_0 = 70 \, \mathrm{km \, s^{-1} \, Mpc^{-3}}$ ,  $\Omega_{\Lambda} = 0.7$ , and  $\Omega_{\mathrm{M}} = 0.3$ . Unless otherwise specified, all magnitudes are given in the AB system.

#### 2. Data set

# 2.1. Photometric data: the ALHAMBRA survey

The ALHAMBRA<sup>1</sup> (Advanced, Large, Homogeneous Area, Medium-Band Redshift Astronomical) survey provides a photometric dataset over 20 contiguous, equal-width, non-overlapping, medium-band optical filters (3500–9700 Å) plus 3 standard broad-band NIR filters *J*, *H*, and *Ks* over 8 different regions of the northern hemisphere (Moles et al. 2008). The survey aims to understand the evolution of the structures and the different families of extragalactic sources throughout cosmic time by sampling a large enough cosmological fraction of the universe. This requires precise photometric redshifts for

http://alhambra.iaa.es:8080

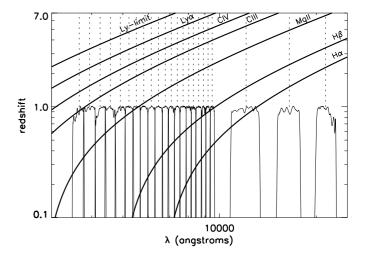
Table 1. ALHAMBRA fields.

Field (i)	Alpha(J2000) (ii)	Delta(J2000) (iii)	Area (deg <sup>2</sup> )	Obs. period (v)	Surveys (vi)	E(B-V) (vii)	Spectro-QSO (viii)	Source (ix)
ALH-2	02 28 32.0	+00 47 00	0.50	Sep.05-Nov.09	DEEP2	0.030	30/29	1,2
ALH-3	09 16 20.0	+46 02 20	0.25	Dec.04-May09	SDSS	0.015	2/2	1
ALH-4	10 00 28.6	+02 12 21	0.25	Dec.04-May09	COSMOS	0.018	81/77	3
ALH-5	12 35 00.0	+61 57 00	0.25	May05–Jun.09	HDF-N	0.011	18/15	1, 4, 5
ALH-6	14 16 38.0	+52 25 05	0.19	Aug.04-Aug.09	EGS-AEGIS	0.011	35/33	1, 2, 6
ALH-7	16 12 10.0	+54 30 00	0.50	Aug.04-Jul.09	SWIRE/ELAIS-N1	0.007	11/11	1, 4, 7
ALH-8	23 45 50.0	+15 34 50	0.50	Aug.04-Aug.09	SDSS	0.024	3/3	1
TOTAL QSOs <sup>(a)</sup>			2.44			180/170		

**Notes.** (i) = ALHAMBRA field name; (ii, iii) = central coordinates of the field; (iv) = area covered by each field; (v) = period between the beginning and the end of the observations in a given field; (vi) = name of the cosmological survey for which a particular ALHAMBRA field overlaps; (vii) = mean Galactic reddening along the line of sight derived by Schlegel et al. (1998) from the *IRAS* 100  $\mu$ m data; (vii) = total number of spectroscopically identified QSOs in the field and those within our selection criteria; (ix) = source of the QSO classification and spectroscopic redshift: (1) = Schneider et al. (2010); (2) = DEEP webpage, Davis et al. (2003); (3) = Brusa et al. (2010); (4) = Veron-Cetty & Veron (2010); (5) = Barger et al. (2008); (6) = Willmer (priv. comm.); (7) = Rowan-Robinson et al. (2008); (a) Sum over all the ALHAMBRA fields of the total/selected spectroscopic QSOs.

several hundreds of thousands objects and, therefore, a survey with high photometric accuracy as well as deep and wide spectral coverage over a large area. The simulations of Benítez et al. (2009), relating the image depth and photo-z accuracy to the number of filters, have demonstrated that the filter-set chosen for ALHAMBRA can achieve a photo-z precision, for normal and star-forming galaxies, that is three times better than a classical 4-5 optical broad-band filter set. The final survey parameters and scientific goals, as well as the technical properties of the filter set were described by Moles et al. (2008). The survey has collected its data for the 20+3 optical-NIR filters in the 3.5 m telescope, at the Calar Alto observatory<sup>2</sup>, using the wide-field camera LAICA in the optical and the OMEGA-2000 camera in the NIR. The full characterization, description, and performance of the ALHAMBRA optical photometric system was presented by Aparicio-Villegas et al. (2010). The strategy of ALHAMBRA for each run has been to observe the fields with the lowest airmasses trying to complete the requested integration time for each filter in order to reach the planned depth (ABmag ~ 25). In consequence, and depending also on the telescope/instrument downtime and weather, the time to complete each filter in each field can vary from months to several years<sup>3</sup>. Therefore, although ALHAMBRA photometry allows us to detect variability, the lack of a common band(s) taken during all the observing runs does not allow us to correct for its effect. The deep NIR counts in one of the ALHAMBRA fields (ALH-8), over ~0.5 deg<sup>2</sup>, which has a 50% detection efficiency depth of  $J \sim 22.4, H \sim 21.3$ , and  $K_s \sim 20.0$  (Vega), have been analyzed by Cristóbal-Hornillos et al. (2009). Their results helped to constrain different type-dependent galaxy evolutionary models.

In this work, we used the seven ALHAMBRA fields for which data have been currently observed and reduced. The central coordinates of these 7 fields, the area covered by each, the observing epoch, their coincidence with other cosmological surveys, and their mean Galactic extinction are detailed in Table 1. The total number of spectroscopically identified QSOs, as well as the fraction selected for our analysis, are given in Col. 7 of Table 1. Figure 1 and Table 2 detail the general characteristics of the ALHAMBRA 23 filter set.



**Fig. 1.** Wavelength coverage of the ALHAMBRA filter set for the LAICA camera CCD1 (thin continuous lines). The position of the most prominent QSO and BLAGN emission lines, plus the Lyman limit, are shown evolving with redshift as thick lines. All filters have been normalized to unity (see Aparicio-Villegas et al. 2010, for their true efficiency). Dotted lines trace each filter central wavelength (Table 2).

The photometric data points used in this work are given by the MAG\_AUTO measure by SExtractor (Bertin & Arnouts 1996). To avoid the excessive weight of some points in the computation of a photo-z, we adopted a minimum photometric error of  $\delta m = 0.05$  (i.e. if a photometric error is smaller than 0.05, it is set to 0.05) for the method described in Sect. 3. In agreement with the results of other authors (e.g. Bolzonella et al. 2000), we found that there is no gain, or even that we obtain poorer results for some objects, when we consider  $\delta m < 0.05$ . The photometric data points of each object were corrected for interstellar extinction using the values of E(B-V) provided by the maps of Schlegel et al. (1998), which are based on IRAS 100  $\mu$ m data<sup>4</sup>.

http://www.caha.es

<sup>&</sup>lt;sup>3</sup> Further details of the observations will be provided in a companion paper.

<sup>4</sup> http://irsa.ipac.caltech.edu/applications/DUST/

Table 2. ALHAMBRA filter characteristics.

Name	$\lambda_{ m mean}$	FWHM	AB	Offset	$\langle m \rangle$	$\langle \sigma(m) \rangle$
	$(\mu m)$	$(\mu m)$	corr.		(AB)	
(1)	(2)	(3)	(4)	(5)	(6)	(7)
A366M	0.3661	0.0279	0.96	-0.033	21.81	0.08
A394M	0.3941	0.0330	0.02	-0.210	21.60	0.05
A425M	0.4249	0.0342	-0.13	-0.081	21.65	0.05
A457M	0.4575	0.0332	-0.18	-0.011	21.62	0.07
A491M	0.4913	0.0356	-0.05	-0.065	21.54	0.06
A522M	0.5224	0.0326	-0.04	-0.054	21.48	0.06
A551M	0.5510	0.0297	0.01	0.003	21.48	0.07
A581M	0.5809	0.0324	0.07	-0.001	21.39	0.05
A613M	0.6134	0.0320	0.13	0.009	21.35	0.06
A646M	0.6461	0.0357	0.23	0.006	21.33	0.08
A678M	0.6781	0.0314	0.24	-0.046	21.20	0.06
A708M	0.7078	0.0332	0.29	-0.055	21.14	0.05
A739M	0.7392	0.0304	0.34	0.007	21.16	0.06
A770M	0.7699	0.0354	0.39	0.000	21.11	0.06
A802M	0.8020	0.0312	0.44	0.002	21.06	0.07
A829M	0.8294	0.0296	0.48	0.007	21.00	0.08
A861M	0.8614	0.0369	0.54	-0.023	20.91	0.05
A892M	0.8918	0.0303	0.50	0.022	20.93	0.08
A921M	0.9208	0.0308	0.48	0.028	20.83	0.10
A948M	0.9482	0.0319	0.52	0.077	20.65	0.15
J	1.2094	0.2471	0.87	0.104	20.65	0.06
H	1.6482	0.2665	1.38	0.186	20.41	0.08
Ks	2.1409	0.3040	1.83	0.155	20.20	0.09

**Notes.** Columns: (1) filter name; (2) filter mean wavelength; (3) filter FWHM; (4) AB-Vega magnitude correction:  $m_{\rm AB} = m_{\rm Vega} + {\rm AB\_correction}$ ; (5) offsets applied to each filter as  $m_{\rm final} = m_{\rm filter} + {\rm offset}$  during the photometric redshift determination (see Sect. 3.3 for details); (6) mean magnitude in each filter band for the spectroscopic sample (Sect. 2.3); (7) mean magnitude errors in each filter band for the spectroscopic sample.

#### 2.2. Sample selection

Broad-line AGNs (BLAGN) and QSOs are powerful emitters over the entire electromagnetic spectrum. They show significant spectral features in the form of intense emission lines (with EW ranging from several tens to several thousands of Å) in the rest-frame UV, optical, and NIR regime. These properties make QSOs easily detectable out to very high redshifts ( $z \sim 6$ ) and perfect candidates to help improve our understanding of the accretion mechanisms within SMBHs ( $M_{\rm BH} > 10^6 \, M_{\odot}$ ). They also probe the distribution of large-scale structures and the physical conditions of the intergalactic medium (IGM). The strong features that characterize the QSO optical emission spectrum allow us to test the ALHAMBRA photometry and its ability to produce *very low resolution spectra*. This would provide a correct spectral classification and a high-precision redshift estimate for the expected population of several thousands of QSOs.

We selected our initial QSO candidates from a subsample of the current ALHAMBRA catalog (v3), which was created using the following photometric criteria:

- A survey quality flag ≥0.7. Each ALHAMBRA source was flagged with a parameter ("percent-weight" in the catalog) that takes into account the total exposure time of a given source relative to the maximum for a given field. A low value of this flag (<0.70) indicates that the source is either within a region strongly affected by the dithering process during the observation, contains bad pixels/artifacts, or is located near a bright (masked) source. A detailed comparison with the deeper photometry data available for some fields from other</p>

- surveys shows that source detections with percent-weight  $\geq$ 0.70 are highly reliable and that a negligible fraction of them are spurious.
- − The source must be within the very high confidence magnitude interval of the survey. The chosen magnitude of reference is A678M filter centered on 6789 Å and the interval is defined by  $17.0 \le A678M \le 23.5$ . The bright magnitude cut ensures that no source saturates any filter, while the faint cut avoids sources with photometric errors larger than  $\approx 0.2$  mag.

We decided against the inclusion of a stellarity criteria, as the precision of the one derived by the SExtractor (Bertin & Arnouts 1996) package was valid only for the brighter part of the QSO sample ( $m_{678} \le 22$ ).

# 2.3. Spectroscopic data

To assess the quality and accuracy of the photo-z determination for the ALHAMBRA database, we compiled all the published or publicly available spectroscopic information for BLAGNs/QSOs. The online services and public spectroscopic catalogs included the Sloan Digital Sky Survey (SDSS<sup>5</sup>) DR7 (Schneider et al. 2010), the Deep Extragalactic Evolutionary Probe (DEEP/DEEP2<sup>6</sup>; Davis et al. 2003), the All-wavelength Extended Groth strip International Survey (AEGIS<sup>7</sup>; Davis et al. 2007), the COSMOS<sup>8</sup> XMM source catalog (Brusa et al. 2010), the GOODS-North redshift compilation by Barger et al. (2008), the SWIRE<sup>9</sup> spectroscopic catalog by Rowan-Robinson et al. (2008) and the 13th edition of the Veron-Cetty & Veron QSOs catalog (2010; VERONCAT<sup>10</sup> hereafter). We verified the quality of the identifications according to the following criteria: i) all spectra from the DR7 SDSS catalog were visually inspected to determine whether they contained broad-line emission; ii) spectra with a high-quality classification flag (flag  $\geq$  3) were selected from the DEEP/DEEP2 and the AEGIS database and visually inspected to confirm that they displayed broad-line emission; iii) as neither a spectral classification nor a redshift quality were given by Barger et al. in the GOODS-N field, valid BLAGN/QSO candidates were selected based on their hard X-ray luminosity ( $L_X[2-8 \text{ kev}]$ ) being brighter that  $10^{43} \text{ erg s}^{-1}$ ; iv) in the COSMOS field, we selected the high-quality public spectra of BLAGN (flags<sup>11</sup> 13, 14, 18, 213, 214, 218; Lilly et al. 2007), while we considered as bona fide BLAGN/QSO the remaining of XMM sources without public data reported by Brusa et al. (2010) as "bl" based on MMT and IMACS spectroscopy; v) all SWIRE sources have high quality spectra (Pérez-Fournón, priv. comm.); and vi) all the sources from the VERONCAT were considered as bone fide BLAGN/QSOs. No lower redshift or absolute magnitude cutoff was included in the source selection as our goal is to test the efficiency of our method and photometry as good redshift estimators not only for the most powerful BLAGNs and QSOs but also for the low redshift Seyfert 1 nuclei, which may provide an important contribution to the total light of their host galaxies. In all cases, the match between the

<sup>5</sup> http://www.sdss.org/

<sup>6</sup> http://deep.ucolick.org

<sup>7</sup> http://aegis.ucolick.org/

<sup>8</sup> http://cosmos.astro.caltech.edu/

<sup>9</sup> http://swire.ipac.caltech.edu/swire/swire.html

<sup>10</sup> http://heasarc.gsfc.nasa.gov/W3Browse/all/veroncat. html

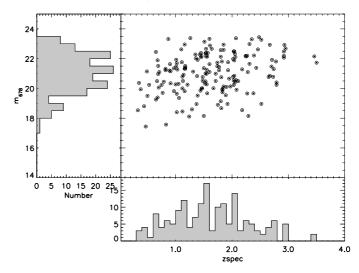
<sup>&</sup>lt;sup>11</sup> Flags 18 and 218 refer to a spectroscopic redshift computed with a single line.

ALHAMBRA photometry and the spectroscopic catalogs was performed using a one arcsec search radius and always identified a unique counterpart. The sources of the BLAGN/QSO spectroscopic redshifts for each of the ALHAMBRA fields are:

- ALH-2: This ~0.5 deg² field partially overlaps the deep strip of SDSS whose DR7 version provides redshifts for 23 QSOs. The common region of this area with field-4 of the DEEP/DEEP2 survey yields 7 additional sources from their data product release 3 (DR3<sup>12</sup>) of the DEEP2 spectroscopic catalog. Of the 30 spectroscopic redshifts for BLAGN/QSO available in the field, 29 (6 from DEEP2 and 23 from SDSS) comply with our photometric criteria.
- ALH-3: This consists of a ~0.25 deg² field area which partially overlaps with that of the SDSS. The matching between ALHAMBRA and SDSS DR7 spectroscopy yields 2 QSO redshifts, for which both sources verify our photometric criteria.
- ALH-4: This is a ~0.25 deg<sup>2</sup> field included in the COSMOS survey area. The common area contains a total of 81 BLAGN/QSO redshifts of which 77 (7 from SDSS and 70 from COSMOS) comply with our photometric criteria.
- ALH-5: This field covers a ~0.25 deg² area overlapping that of the GOODS-N. There are a total of 18 BLAGN/QSOs with spectroscopic redshifts (9 from SDSS, 6 from Barger et al. 2008, and 3 from the VERONCAT). Of these, 15 (7 from SDSS, 6 from GOODS-N, and 2 from the VERONCAT) comply with our photometric criteria.
- ALH-6: This ~0.19 deg² field is centered on the GROTH strip and therefore overlaps with the DEEP2, AEGIS, and SDSS surveys. In total, there are 35 spectroscopically identified BLAGN/QSO in this field, of which 33 sources (6 SDSS, 6 DEEP2 and 21 AEGIS) comply with our photometric criteria.
- ALH-7: A ~0.5 deg<sup>-2</sup> field centered on the ELAIS-N1 of the SWIRE survey. Sources with spectroscopic redshifts and classifications are provided by the catalog of Rowan-Robinson et al. (2008), the SDSS spectroscopy and the VERONCAT. All 11 BLAGN/QSO found in this field (1 from SDSS, 8 from SWIRE, and 2 from VERONCAT) comply with our photometric criteria.
- ALHAMBRA-8: The 3 QSO spectroscopic identifications in this ~0.5 deg<sup>2</sup> field are provided exclusively by the QSO DR7 catalog of the SDSS. All 3 sources comply with our photometric criteria.

The final spectroscopic catalog of the ALHAMBRA fields includes 94% (170/180) of the total numbers of sources spectroscopically identified in the different fields. The ALH4-COSMOS field contains  $\sim\!44\%$  of the sources, followed by the ALH2 and ALH6 fields (DEEP2/AEGIS) which corresponds to  $\sim\!17\%$  and 19% of the IDs, respectively. Table 1 details the number of identified sources in each field, while Fig. 2 shows the redshift distribution of the selected spectroscopic sample.

Although the surveys from which the spectroscopic sample is extracted encompass a wide range of selection criteria (color selection in the SDSS, optical flux-limited in zCOSMOS\_bright, X-ray selected for IMACS and MMT spectroscopy, etc.), we find their redshift distribution compatible within the errors. The mean redshift and  $1\sigma$  dispersion for the sources extracted from the different spectroscopic catalogs are:  $1.61\pm0.63$  (SDSS),  $1.99\pm0.68$  (zCOSMOS\_faint),  $1.92\pm0.64$  (zCOSMOS\_bright),  $1.24\pm0.45$  (MMT),  $1.55\pm0.66$  (IMACS),  $1.81\pm0.81$  (GOODS-N),



**Fig. 2.** Magnitude-redshift distribution of the selected spectroscopic sample.

 $1.56 \pm 0.88$  (DEEP2),  $1.56 \pm 0.63$  (AEGIS),  $1.42 \pm 0.69$  (SWIRE), and  $1.24 \pm 0.78$  (VeronCat).

# 3. QSO photo-z determination

We used the publicly available template fitting code  $LePhare^{13}$  (Arnouts et al. 1999; Ilbert et al. 2006) to estimate redshifts for our selected QSOs. The code matches the photometric data of each ALHAMBRA QSO source to a library of available templates providing the best-fit, spectral classification, and photometric redshift by means of a  $\chi^2$  minimization process. The minimization process accepts the inclusion of user-supplied priors, different extinction laws, and the possibility to apply systematic offsets to the different photometric bands in order to achieve the best match between the colors of the sample and those provided by the template library. The full capabilities and possibilities of the LePhare minimization code was extensively discussed by Ilbert et al. (2006, 2009). Our final selection of templates, adopted reddening laws, priors, and systematic offsets are discussed in the following sections.

#### 3.1. Template selection

The list of extragalactic templates used in this work are detailed in Table 3 and Fig. 3. The selection includes SEDs for QSOs, Seyferts, starburst, normal galaxies, and stars. To include low luminosity BLAGN that are partially or completely dominated by their host galaxy light, we adopted the hybrid templates (consisting of a mixture of QSO and host galaxy SEDs) introduced by Salvato et al. (2009). The variety of templates is justified by the need to test the ability of the ALHAMBRA survey to differentiate broad-line AGN emission from that of other extragalactic sources or stars, and enable us to do a blind search for these sources (Matute et al., in prep.).

In Table 3 and Fig. 3, the templates are organized as:

Non-active and starburst galaxies: this includes 3 elliptical templates of different ages (2, 5, and 13 Gyr; #1–3), the starburst galaxies Arp 220, M 82, NGC 6240, IRAS 20551, and IRAS 22491<sup>14</sup> (#4–8) and 7 spirals (S0 through Sd; #9–15).

<sup>12</sup> http://deep.berkeley.edu/DR3/dr3.primer.html

http://www.oamp.fr/people/arnouts/LE\_PHARE.html

<sup>&</sup>lt;sup>14</sup> May contain an AGN responsible for 20% of the bolometric flux (e.g. Veilleux et al. 2009).

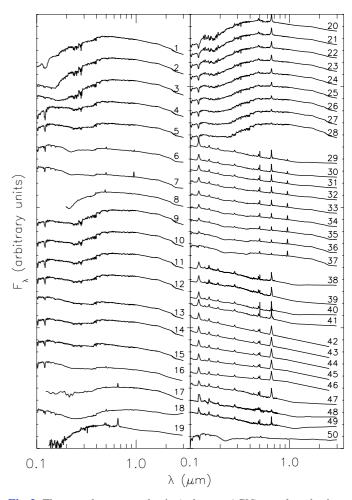
Table 3. Extragalactic template library.

Tell2	Index	SED name	Class
Second	1	Ell2	Elliptical (5 Gyr old) <sup>a</sup>
4 Arp220 Starburst a  M82 "a  6 IRAS 20551–4250 "a  IRAS 22491–1808 "a  8 NGC 6240 "a  9 S0 S0 S0 a  10 Sa Sa Sa a  11 Sb Sb Sb a  12 Sc Sc Sc a  13 Sdm Sdm Sdm a  14 Sd Sd Sd a  15 Spi4 Spiral a  16 Sey18 Seyfert 1.8 a  17 Sey2 Seyfert 2 a  18 IRAS 19254-7245 Seyfert 2 a  19 QSO2 QSO 2 a  20 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QS02 b  21 hyb1_gal20_agn80  12 hyb1_gal30_agn70  23 hyb1_gal40_agn60  24 hyb1_gal50_agn50  25 hyb1_gal80_agn20  26 hyb1_gal90_agn10 Hybrid 90% S0 + 10% QS02 Hybryd 10% 122491 + 90% TQSO1 b  Myb2_gal70_agn30  31 hyb2_gal80_agn20  32 hyb2_gal90_agn10 Hybryd 90% I22491 + 10% TQSO1 D  Myb2_gal90_agn10 GSO1  Mybryd 90% I22491 + 10% TQSO1 D  QSO (low-luminosity) b  QSO (male 1 in the composite a  QSO (synthetic c  QSO synthetic c	2	Ell5	Elliptical (2 Gyr old) <sup>a</sup>
4 Arp220 Starburst a  M82 "a  6 IRAS 20551–4250 "a  IRAS 22491–1808 "a  8 NGC 6240 "a  9 S0 S0 S0 a  10 Sa Sa Sa a  11 Sb Sb Sb a  12 Sc Sc Sc a  13 Sdm Sdm Sdm a  14 Sd Sd Sd a  15 Spi4 Spiral a  16 Sey18 Seyfert 1.8 a  17 Sey2 Seyfert 2 a  18 IRAS 19254-7245 Seyfert 2 a  19 QSO2 QSO 2 a  20 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QS02 b  21 hyb1_gal20_agn80  12 hyb1_gal30_agn70  23 hyb1_gal40_agn60  24 hyb1_gal50_agn50  25 hyb1_gal80_agn20  26 hyb1_gal90_agn10 Hybrid 90% S0 + 10% QS02 Hybryd 10% 122491 + 90% TQSO1 b  Myb2_gal70_agn30  31 hyb2_gal80_agn20  32 hyb2_gal90_agn10 Hybryd 90% I22491 + 10% TQSO1 D  Myb2_gal90_agn10 GSO1  Mybryd 90% I22491 + 10% TQSO1 D  QSO (low-luminosity) b  QSO (male 1 in the composite a  QSO (synthetic c  QSO synthetic c	3	Ell13	Elliptical (13 Gyr old) <sup>a</sup>
5         M82         "a           6         IRAS 20551-4250         "a           7         IRAS 22491-1808         "a           8         NGC 6240         "a           9         SO         SO a           10         Sa         Sa a           11         Sb         Sb           12         Sc         Sc a           13         Sdm         Sdm a           14         Sd         Sd a           15         Spi4         Spiral a           16         Sey18         Seyfert 1.8 a           17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% S0 + 90% QS02 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           28         hyb1_gal30_agn70            30         hyb2_gal40_agn60            31         hyb2_gal30_agn		Arp220	
7 IRAS 22491-1808 8 NGC 6240 9 S0 S0 a 10 Sa Sa a 11 Sb Sb Sb a 12 Sc Sc Sc a 13 Sdm Sdm a 14 Sd Sq a 15 Spi4 Spiral a 16 Sey18 Seyfert 1.8 a 17 Sey2 Seyfert 2 a 18 IRAS 19254-7245 Seyfert 2 a 19 QSO2 QSO 2 a 10 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QSO2 b 11 hyb1_gal20_agn80 12 hyb1_gal30_agn70 13 hyb1_gal40_agn60 14 hyb1_gal50_agn50 15 hyb1_gal60_agn40 16 hyb1_gal70_agn30 17 hyb1_gal80_agn20 Hybrid 10% S0 + 10% QSO2 hyb1_gal70_agn30 18 hyb2_gal30_agn70 19 Hybrid 90% S0 + 10% QSO2 Hybryd 10% I22491 + 90% TQSO1 b 19 hyb2_gal40_agn60 10 hyb2_gal30_agn70 11 hyb2_gal30_agn70 12 hyb2_gal40_agn60 13 hyb2_gal30_agn70 14 hyb2_gal80_agn20 15 hyb2_gal40_agn60 16 hyb2_gal40_agn60 17 hyb2_gal40_agn60 18 hyb2_gal40_agn60 19 hyb2_	5	•	" a
8 NGC 6240 "" a" 9 S0 S0 " 10 Sa Sa " Sa " 11 Sb Sb " Sb " 12 Sc Sc Sc " 13 Sdm Sdm Sdm " 14 Sd Sd " 15 Spi4 Spiral " 16 Sey18 Seyfert 1.8 " 17 Sey2 Seyfert 2 " 18 IRAS 19254-7245 Seyfert 2 " 19 QSO2 QSO 2 " 20 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QSO2 b 21 hyb1_gal20_agn80 22 hyb1_gal30_agn70 23 hyb1_gal40_agn60 24 hyb1_gal50_agn50 25 hyb1_gal70_agn30 26 hyb1_gal90_agn10 Hybrid 90% S0 + 10% QSO2 Hybrl_gal80_agn20 27 hyb2_gal10_agn90 Hybrid 10% I22491 + 90% TQSO1 b 30 hyb2_gal20_agn80 31 hyb2_gal30_agn70 32 hyb2_gal40_agn60 33 hyb2_gal50_agn50 34 hyb2_gal60_agn40 35 hyb2_gal70_agn30 36 hyb2_gal80_agn20 37 hyb2_gal90_agn10 Hybrid 90% S0 + 10% QSO2 Hybryd 10% I22491 + 90% TQSO1 b 38 QSOL 39 QSOH QSO (low-luminosity) b 40 TQSO1 QSO (low-luminosity) b 40 TQSO1 QSO (high-luminosity) b 40 TQSO1 QSO (high-luminosity) b 40 TQSO1 QSO (synthetic c) 43 syth_qso-0.25 QSO synthetic c 5 " "	6	IRAS 20551-4250	» a
9 S0 S0 a 10 Sa Sa a 11 Sb Sb Sb a 12 Sc Sc Sc a 13 Sdm Sdm Sdm a 14 Sd Sd Spiral a 15 Spi4 Seyfert 1.8 a 16 Sey18 Seyfert 2 a 18 IRAS 19254-7245 Seyfert 2 a 19 QSO2 QSO 2 a 20 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QSO2 b 21 hyb1_gal20_agn80 22 hyb1_gal30_agn70 23 hyb1_gal40_agn60 24 hyb1_gal50_agn50 25 hyb1_gal60_agn40 26 hyb1_gal70_agn30 27 hyb1_gal80_agn20 Hybrid 90% S0 + 10% QSO2 28 hyb1_gal90_agn10 Hybrid 90% S0 + 10% QSO2 29 hyb2_gal10_agn90 Hybryd 10% I22491 + 90% TQSO1 b 30 hyb2_gal20_agn80 31 hyb2_gal30_agn70 32 hyb2_gal40_agn60 33 hyb2_gal50_agn50 34 hyb2_gal60_agn40 35 hyb2_gal70_agn30 36 hyb2_gal70_agn30 37 hyb2_gal80_agn20 38 QSOL QSO (low-luminosity) b 40 TQSO1 QSO (high-luminosity) b 40 TQSO1 QSO (high-luminosity) b 40 TQSO1 QSO (synthetic c 43 syth_qso-0.25 Syth_qso-0.50 30 QSO synthetic c 31 QSO (So Synthetic c 32 QSO synthetic c 33 Syth_qso-0.25 QSO synthetic c 34 Syth_qso-0.50 36 QSO synthetic c 37 QSO (synthetic c 38 QSO synthetic c 38 QSO synthetic c 39 QSO synthetic c 39 QSO synthetic c 39 QSO synthetic c 30 QSO synthetic c 30 QSO synthetic c 30 QSO synthetic c 31 Pybryd 90% 122491 + 10% TQSO1 QSO composite a 31 QSO1	7	IRAS 22491-1808	" a
10	8	NGC 6240	" a
11 Sb Sb Sb a 12 Sc Sc Sc a 13 Sdm Sdm a 14 Sd Sd Sd a 15 Spi4 Spiral a 16 Sey18 Seyfert 1.8 a 17 Sey2 Seyfert 2 a 18 IRAS 19254-7245 Seyfert 2 a 19 QSO2 QSO 2 a 20 hyb1_gal10_agn90 Hybrid 10% SO + 90% QSO2 b 21 hyb1_gal20_agn80 22 hyb1_gal30_agn70 23 hyb1_gal40_agn60 24 hyb1_gal50_agn50 25 hyb1_gal60_agn40 26 hyb1_gal70_agn30 27 hyb1_gal80_agn20 28 hyb1_gal90_agn10 Hybrid 90% SO + 10% QSO2 Hybryd 10% I22491 + 90% TQSO1 b 30 hyb2_gal20_agn80 31 hyb2_gal30_agn70 32 hyb2_gal40_agn60 33 hyb2_gal50_agn50 34 hyb2_gal60_agn40 35 hyb2_gal70_agn30 36 hyb2_gal80_agn20 37 hyb2_gal80_agn20 38 QSOL QSO (low-luminosity) b 40 TQSO1 QSO composite a 41 QSO1 "a 42 syth_qso-0.25 QSO synthetic <sup>c</sup> 43 syth_qso-0.50 "a	9	S0	$S0^{a}$
12         Sc         Sc a           13         Sdm         Sdm a           14         Sd         Sd a           15         Spi4         Spiral a           16         Sey18         Seyfert 1.8 a           17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% S0 + 90% QS02 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal50_agn50            25         hyb1_gal80_agn20            26         hyb1_gal80_agn20            27         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           28         hyb1_gal90_agn10         Hybryd 10% I22491 + 90% TQSO1 b           30         hyb2_gal30_agn70            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal70_agn30            34         hyb2_ga	10	Sa	Sa <sup>a</sup>
13         Sdm         Sd a sd a           14         Sd         Spiral a spiral a           16         Sey18         Seyfert 1.8 a seyfert 2 a           17         Sey2         Seyfert 2 a seyfer 2 a seyfert 2 a seyfer 2 a seyfert 2 a seyfe	11	Sb	Sb <sup>a</sup>
14         Sd         Sd a           15         Spi4         Spiral a           16         Sey18         Seyfert 1.8 a           17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% SO + 90% QSO2 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal50_agn50            25         hyb1_gal60_agn40            26         hyb1_gal80_agn20            27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% SO + 10% QSO2           29         hyb2_gal10_agn90         Hybrid 90% SO + 10% QSO2           29         hyb2_gal20_agn80            31         hyb2_gal30_agn70            32         hyb2_gal30_agn70            33         hyb2_gal80_agn20            34         hyb2_gal80_agn20            37	12	Sc	Sc <sup>a</sup>
15         Spi4         Spiral a           16         Sey18         Seyfert 1.8 a           17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% S0 + 90% QSO2 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal50_agn50            25         hyb1_gal60_agn40            26         hyb1_gal80_agn20            27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           29         hyb2_gal10_agn90         Hybryd 10% 122491 + 90% TQSO1 b           30         hyb2_gal30_agn70            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal80_agn20            34         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1<	13	Sdm	Sdm <sup>a</sup>
16         Sey18         Seyfert 1.8 a           17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% S0 + 90% QS02 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal50_agn50            25         hyb1_gal60_agn40            26         hyb1_gal70_agn30            27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           29         hyb2_gal10_agn90         Hybryd 10% I22491 + 90% TQSO1 b           30         hyb2_gal30_agn70            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal70_agn30            34         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (high	14	Sd	Sd <sup>a</sup>
17         Sey2         Seyfert 2 a           18         IRAS 19254-7245         Seyfert 2 a           19         QSO2         QSO 2 a           20         hyb1_gal10_agn90         Hybrid 10% S0 + 90% QSO2 b           21         hyb1_gal20_agn80            22         hyb1_gal30_agn70            23         hyb1_gal40_agn60            24         hyb1_gal50_agn50            25         hyb1_gal60_agn40            26         hyb1_gal70_agn30            27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           29         hyb2_gal10_agn90         Hybryd 10% I22491 + 90% TQSO1 b           30         hyb2_gal30_agn70            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal70_agn30            34         hyb2_gal80_agn20            35         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           40         TQSO1	15	Spi4	Spiral <sup>a</sup>
18       IRAS 19254-7245       Seyfert 2 a QSO 2 a         19       QSO2       QSO 2 a         20       hyb1_gal10_agn90       Hybrid 10% S0 + 90% QSO2 b         21       hyb1_gal20_agn80          22       hyb1_gal30_agn70          23       hyb1_gal40_agn60          24       hyb1_gal50_agn50          25       hyb1_gal60_agn40          26       hyb1_gal70_agn30          27       hyb1_gal80_agn20          28       hyb1_gal90_agn10       Hybrid 90% S0 + 10% QS02         29       hyb2_gal10_agn90       Hybryd 10% I22491 + 90% TQSO1         30       hyb2_gal20_agn80          31       hyb2_gal30_agn70          32       hyb2_gal40_agn60          33       hyb2_gal70_agn30          34       hyb2_gal80_agn20          35       hyb2_gal90_agn10       Hybryd 90% I22491 + 10% TQSO1         38       QSOL       QSO (low-luminosity) b         40       TQSO1       QSO (somposite a         41       QSO1       "a         42       syth_qso-0.25       QSO synthetic²	16	Sey18	Seyfert 1.8 <sup>a</sup>
19 QSO2 QSO 2 a 20 hyb1_gal10_agn90 Hybrid 10% S0 + 90% QSO2 b 21 hyb1_gal20_agn80 22 hyb1_gal30_agn70 23 hyb1_gal40_agn60 24 hyb1_gal50_agn50 25 hyb1_gal60_agn40 26 hyb1_gal70_agn30 27 hyb1_gal80_agn20 28 hyb1_gal90_agn10 Hybrid 90% S0 + 10% QSO2 29 hyb2_gal10_agn90 Hybryd 10% I22491 + 90% TQSO1 b 30 hyb2_gal30_agn70 31 hyb2_gal30_agn70 32 hyb2_gal40_agn60 33 hyb2_gal50_agn50 34 hyb2_gal60_agn40 35 hyb2_gal70_agn30 36 hyb2_gal80_agn20 37 hyb2_gal90_agn10 Hybryd 90% I22491 + 10% TQSO1 38 QSOL QSO (low-luminosity) b 40 TQSO1 QSO (high-luminosity) b 40 TQSO1 QSO composite a 41 QSO1 42 syth_qso-0.25 QSO synthetic <sup>c</sup> 43 syth_qso-0.50  28 Hybrid 10% S0 + 90% QSO2 b 41 Pybrid 10% S0 + 90% QSO2 b 42 Syth_qso-0.25 QSO synthetic <sup>c</sup> 39 QSO synthetic <sup>c</sup>	17	Sey2	Seyfert 2 <sup>a</sup>
20	18	IRAS 19254-7245	Seyfert 2 <sup>a</sup>
21  hyb1_gal20_agn80	19	QSO2	QSO 2 <sup>a</sup>
22       hyb1_gal30_agn70          23       hyb1_gal40_agn60          24       hyb1_gal50_agn50          25       hyb1_gal60_agn40          26       hyb1_gal70_agn30          27       hyb1_gal80_agn20          28       hyb1_gal90_agn10       Hybrid 90% S0 + 10% QS02         29       hyb2_gal10_agn90       Hybryd 10% I22491 + 90% TQSO1         30       hyb2_gal20_agn80          31       hyb2_gal30_agn70          32       hyb2_gal40_agn60          33       hyb2_gal50_agn50          34       hyb2_gal70_agn30          35       hyb2_gal80_agn20          36       hyb2_gal90_agn10       Hybryd 90% I22491 + 10% TQSO1         38       QSOL       QSO (low-luminosity) b         40       TQSO1       QSO (somposite a         41       QSO1       "a         42       syth_qso-0.25       QSO synthetic²         43       syth_qso-0.50       "	20	hyb1_gal10_agn90	Hybrid 10% S0 + 90% QS02 b
22       hyb1_gal30_agn70          23       hyb1_gal40_agn60          24       hyb1_gal50_agn50          25       hyb1_gal60_agn40          26       hyb1_gal70_agn30          27       hyb1_gal80_agn20          28       hyb1_gal90_agn10       Hybrid 90% S0 + 10% QS02         29       hyb2_gal10_agn90       Hybryd 10% I22491 + 90% TQSO1         30       hyb2_gal20_agn80          31       hyb2_gal30_agn70          32       hyb2_gal40_agn60          33       hyb2_gal50_agn50          34       hyb2_gal70_agn30          35       hyb2_gal80_agn20          36       hyb2_gal90_agn10       Hybryd 90% I22491 + 10% TQSO1         38       QSOL       QSO (low-luminosity) b         40       TQSO1       QSO (somposite a         41       QSO1       "a         42       syth_qso-0.25       QSO synthetic²         43       syth_qso-0.50       "	21	hyb1_gal20_agn80	···
24  hyb1_gal50_agn50	22		···
25  hyb1_gal60_agn40	23	hyb1_gal40_agn60	···
26         hyb1_gal70_agn30            27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           29         hyb2_gal10_agn90         Hybryd 10% I22491 + 90% TQSO1 b           30         hyb2_gal20_agn80            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal50_agn50            34         hyb2_gal60_agn40            35         hyb2_gal70_agn30            36         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           40         TQSO1         QSO (high-luminosity) b           40         TQSO1         QSO composite a           41         QSO1         "a           42         syth_qso-0.25         QSO synthetic²           43         syth_qso-0.50         "a	24	hyb1_gal50_agn50	···
27         hyb1_gal80_agn20            28         hyb1_gal90_agn10         Hybrid 90% S0 + 10% QS02           29         hyb2_gal10_agn90         Hybryd 10% I22491 + 90% TQSO1 b           30         hyb2_gal20_agn80            31         hyb2_gal30_agn70            32         hyb2_gal40_agn60            33         hyb2_gal50_agn50            34         hyb2_gal60_agn40            35         hyb2_gal70_agn30            36         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           40         TQSO1         QSO (high-luminosity) b           40         TQSO1         QSO composite a           41         QSO1         "a           42         syth_qso-0.25         QSO synthetic²           43         syth_qso-0.50         "a	25	hyb1_gal60_agn40	<b></b>
28	26		···
29  hyb2_gal10_agn90  Hybryd 10% I22491 + 90% TQSO1 b 30  hyb2_gal20_agn80  31  hyb2_gal30_agn70  32  hyb2_gal40_agn60  33  hyb2_gal50_agn50  34  hyb2_gal60_agn40  35  hyb2_gal70_agn30  36  hyb2_gal70_agn30  37  hyb2_gal90_agn10  Hybryd 90% I22491 + 10% TQSO1 38  QSOL  QSO (low-luminosity) b 40  TQSO1  QSO (high-luminosity) b 40  TQSO1  QSO composite a 41  QSO1  "a 42  syth_qso-0.25  QSO synthetic² 43  syth_qso-0.50  "SON TQSO1"	27	hyb1_gal80_agn20	<b></b>
30  hyb2_gal20_agn80	28	hyb1_gal90_agn10	Hybrid 90% S0 + 10% QS02
31       hyb2_gal30_agn70          32       hyb2_gal40_agn60          33       hyb2_gal50_agn50          34       hyb2_gal60_agn40          35       hyb2_gal70_agn30          36       hyb2_gal80_agn20          37       hyb2_gal90_agn10       Hybryd 90% I22491 + 10% TQSO1         38       QSOL       QSO (low-luminosity) b         39       QSOH       QSO (high-luminosity) b         40       TQSO1       QSO composite a         41       QSO1       "a         42       syth_qso-0.25       QSO synthetic²         43       syth_qso-0.50       "	29	hyb2_gal10_agn90	Hybryd 10% I22491 + 90% TQSO1 b
32  hyb2_gal40_agn60	30	hyb2_gal20_agn80	···
33  hyb2_gal50_agn50	31	hyb2_gal30_agn70	
34         hyb2_gal60_agn40            35         hyb2_gal70_agn30            36         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           39         QSOH         QSO (high-luminosity) b           40         TQSO1         QSO composite a           41         QSO1         "a           42         syth_qso-0.25         QSO synthetic²           43         syth_qso-0.50         "	32	hyb2_gal40_agn60	<b></b>
35	33	hyb2_gal50_agn50	<b></b>
36         hyb2_gal80_agn20            37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           39         QSOH         QSO (high-luminosity) b           40         TQSO1         QSO composite a           41         QSO1         " a           42         syth_qso-0.25         QSO syntheticc           43         syth_qso-0.50         " "	34	hyb2_gal60_agn40	
37         hyb2_gal90_agn10         Hybryd 90% I22491 + 10% TQSO1           38         QSOL         QSO (low-luminosity) b           39         QSOH         QSO (high-luminosity) b           40         TQSO1         QSO composite a           41         QSO1         " a           42         syth_qso-0.25         QSO syntheticc           43         syth_qso-0.50         " "	35	hyb2_gal70_agn30	
38 QSOL QSO (low-luminosity) $^b$ 39 QSOH QSO (high-luminosity) $^b$ 40 TQSO1 QSO composite $^a$ 41 QSO1 " $^a$ 42 syth_qso-0.25 QSO synthetic $^c$ 43 syth_qso-0.50 "	36	hyb2_gal80_agn20	
39 QSOH QSO (high-luminosity) <sup>b</sup> 40 TQSO1 QSO composite <sup>a</sup> 41 QSO1 "a 42 syth_qso-0.25 QSO synthetic <sup>c</sup> 43 syth_qso-0.50 "	37	hyb2_gal90_agn10	Hybryd 90% I22491 + 10% TQSO1
40 TQSO1 QSO composite <sup>a</sup> 41 QSO1 "a 42 syth_qso=0.25 QSO synthetic <sup>c</sup> 43 syth_qso=0.50 "	38	QSOL	QSO (low-luminosity) b
41 QSO1 "a 42 syth_qso-0.25 QSO synthetic <sup>c</sup> 43 syth_qso-0.50 "	39	QSOH	QSO (high-luminosity) b
42 syth_qso-0.25 QSO synthetic <sup>c</sup> 43 syth_qso-0.50 "	40	TQSO1	QSO composite <sup>a</sup>
43 syth_qso-0.50 "	41	QSO1	" a
45 Sytti_qs0=0.30	42	syth_qso-0.25	QSO synthetic <sup>c</sup>
44 syth gso-0.75 "	43		
~/	44	syth_qso-0.75	£ ¢
45 syth_qso-1.00 "	45	syth_qso-1.00	,,
46 syth_qso-1.25 "	46	syth_qso-1.25	
47 QSO_Cristiani QSO <sup>d</sup>	47	-	$\operatorname{QSO}{}^d$
48 QSO_VVDS QSO composite <sup>e</sup>	48	QSO_VVDS	· 1
49 QSO_vandenBerk QSO composite <sup>f</sup>	49	QSO_vandenBerk	QSO composite <sup>f</sup>
50 Mrk231 BALQSO <sup>a</sup>	50	Mrk231	BALQSO <sup>a</sup>

**References.** <sup>(a)</sup> Polletta et al. (2007). <sup>(b)</sup> Salvato et al. (2009). <sup>(c)</sup> LePhare template database. <sup>(d)</sup> Cristiani & Vio (1990). <sup>(e)</sup> Gavignaud et al. (2006). <sup>(f)</sup> Vanden Berk et al. (2001).

They are all part of the SED library published by Polletta et al. (2007).

- Obscured BLAGN: includes the Polletta et al. (2007) composite templates of a Seyfert 1.8 and a Seyfert 2 and the Seyfert-2 IRAS 19254 (#16–18). The high-luminosity



**Fig. 3.** The complete extragalactic (galaxy + AGN) template database used in this work. The source and spectral class for each template given in Table 3 and described in Sect. 3.1.

obscured sources are represented by a type-2 QSO (QSO2) and the BALQSO Mrk 231 templates (Polletta et al. 2007; #19 & #50). We also added the hybrid template library of Salvato et al. (2009) defined by 9 different combinations of a S0 and a QSO2 template (#20–28).

– QSO and hybrid-QSO templates: here we considered both the high and low luminosity SDSS composites (indices #38, #39), two templates from Polletta et al. (2007; QSO1 and TQSO1 with indices #40 and #41), the Cristiani & Vio QSO SED (#47), the VVDS mean QSO SED (Gavignaud et al. 2006; #48), and the mean QSO from Vanden Berk et al. (2001; #49) also based on SDSS data. Hybrid templates include 9 different combinations of the starburst/ULIRG IRAS 22491 template and a QSO1 template (Salvato et al. 2009; #29–#37). As the quality and accuracy of the fit improved in several cases, we completed the list with a set of 5 synthetic QSO templates (#42–46), covering continuum slopes ( $\nu^{\alpha}$ ) from  $\alpha = -0.25$  to  $\alpha = -1.25$  (in steps of 0.25) below 1 μm and fixed at  $\alpha = -0.7$  above 1 μm (*LePhare* template database and references therein).

Finally, the stellar template database includes 131 spectra from the Pickels (1998) stellar library plus 4 spectra of white dwarfs from Bohlin et al. (1995) and 19 additional templates from the *LePhare* stellar library. Stellar templates were also included because white dwarfs and F/G stars QSOs have similar colors to F/G stars in the z = [2-3] redshift interval. Thus, our final

database contains 204 templates (50 extragalactic + 154 stellar). During the minimization process, Galactic and extragalactic templates were used separately.

#### 3.2. Extinction

The photometry for several of the sources analyzed in this work defines a continuum that strongly deviates from single or even double power-laws, most probably because of dust obscuration. For many of these types of sources, there is an ongoing debate about whether (some of) these red QSOs are obscured by either dust or an intrinsically red continuum (Richards et al. 2003; Young et al. 2008). Thus, our multiband template fit takes into account the possibility of intrinsic dust obscuration within the source. We adopted the Small Magellanic Cloud (SMC) extinction law (Prevot et al. 1994), which has been shown to reproduce the observed reddening for mildly obscured QSOs at z < 2.2, for which there are no indications of the Galactic feature at 2175 Å (Hopkins et al. 2004; Richards et al. 2003; York et al. 2006). Gallerani et al. (2010) appeared to measure some deviation from the SMC extinction law for higher redshift sources which is one reason for adopting alternative extinction laws (see below). The attenuation due to dust  $(A_V)$  is given as a function of the color excess E(B-V) as  $A_V = R_V \times E(B-V)$ . We assumed  $R_V = 3.1$ and a color excess in the range [0, 1].

Furthermore, as our spectroscopic sample includes lower redshift Seyfert 1 nuclei, which may have a strong host-galaxy contribution, we considered alternative extinction laws as the dust present in different galaxy types follow extinction curves that deviate from that of the SMC. These deviations include variations of the steepness in the attenuation curve as in the starburst extinction law derived by Calzetti et al. (2000), or the presence of a broad bump around 2175 Å as found for the Milky Way (MW; Seaton et al. 1979; Cardelli et al. 1989) or the Large Magellanic Cloud (LMC; Fitzpatrick 1986). Therefore, to reproduce normal galaxy and starburst spectra we also considered in the  $\chi^2$  minimization solutions based on the LMC, MW, Calzetti's law, and Calzetti's law plus the absorption feature around 2175 Å. In this case, the minimization process takes into account all possible SEDs and extinction laws simultaneously, choosing the best suited to each source. These additional extinction laws allow us to probe their relevance to the accuracy of the results.

The light attenuation by the inter-galactic medium (IGM) was taken into account internally by *LePhare* following the opacity curves, binned into redshift intervals of  $\Delta z = 0.1$ , published by Madau (1995).

### 3.3. Systematic offsets

Photometric redshifts depend strongly on the precision of the photometry and the capabilities of the template database to reproduce the colors of the source population as a function of z. If we were to assume that the selected template database is representative of our source population, then for a given filter the average deviation between the observed flux and the best-fit predicted flux should be zero for normally distributed uncertainties. If this is not the case, a zero-point offset must be applied to the photometry derived from the template database when there is a non-zero average deviation between the observed and predicted fluxes. The ALHAMBRA photometric calibration is based on a selection of NGSL stars following the methodology discussed in Aparicio-Villegas et al. (2010). We note here that we have not modified this criteria. The computed offsets instead,

"adapt" the templates to provide a better fit the observed photometry. Therefore, alternative templates or object selection can (and will) lead to different offsets (e.g. Table 1 by Ilbert et al. 2006).

We used the spectroscopic sample described in Sect. 2 and the colors in the filters A457M, A646M, and A829M to compute these systematic offsets using an iterative approach of find the best-fit SED for each source, deriving the mean deviations for each filter, applying offsets, re-computing best-fit SEDs, etc. The iteration process was halted when the variation in  $\chi^2$  between iterations drops below 2%. In general, the procedure did not require more than 4 iterations to converge. We found that the offsets to be applied are small and agree with the typical photometric error for each band in the sample. Table 2 reports the values of these corrections as well as the typical photometric error for each band in Cols. 5 and 7, respectively.

#### 3.4. Priors

The introduction of important a priori information into the redshift probability distribution function (Pdz) based on Bayesian probability can in many cases improve the quality of the solutions by favoring a particular redshift based on known redshifts and/or color distributions (e.g. Benítez 2000). Our analysis only makes use of a particular luminosity and redshift range prior and does not include any redshift distribution or color information of known BLAGN/QSO populations. We restricted the permitted absolute magnitudes in the A457M ( $\lambda$ 4575 Å) filter between -17 and -28. Absolute magnitudes in this filter are consistent with the commonly used broad-band standard filter B. This includes not only the typical range where most BLAGN/QSOs are found ( $-28 \le M_{457} \le -20$ ) but also the range for host-dominated BLAGN and normal galaxies (Salvato et al. 2009; Polletta et al. 2007; Rowan-Robinson et al. 2008).

#### 3.5. Photo-z determination summary

We used the code *LePhare* to estimate photometric redshifts for 170 spectroscopically identified BLAGN and QSOs with high quality ALHAMBRA photometry. For the  $\chi^2$  minimization process, we considered the following:

- A database of 204 templates: 154 stellar and 50 extragalactic.
- Several extinction laws: MW, LMC, SMC, and Calzetti's starburst laws with a color-excess range of E(B V) = [0.0,1.0].
- Given our template library, we made a correction to the zeropoint of the filters that show a non-zero average deviation between the observed and best-fit predicted magnitudes.
- A simple luminosity prior of  $-17 \le M_{A457M} \le -28$ .
- A redshift space interval of  $0 \le z \le 6$  binned in redshifts intervals of  $\delta z = 0.04$ .

Figure 4 shows an example of the excellent agreement between the data and the fitted template for 6 sources with a wide range of magnitudes ( $20 \le m_{A678M} \le 23.5$ ), redshifts ( $0.7 \le z \le 2.3$ ), and intrinsic extinctions ( $0.0 \le E[B-V] \le 0.2$ ).

# 4. Results and discussion

#### 4.1. Photo-z accuracy

The efficiency of the photo-z determination is quantified by comparing the spectroscopic redshifts (hereafter spectro-z) of

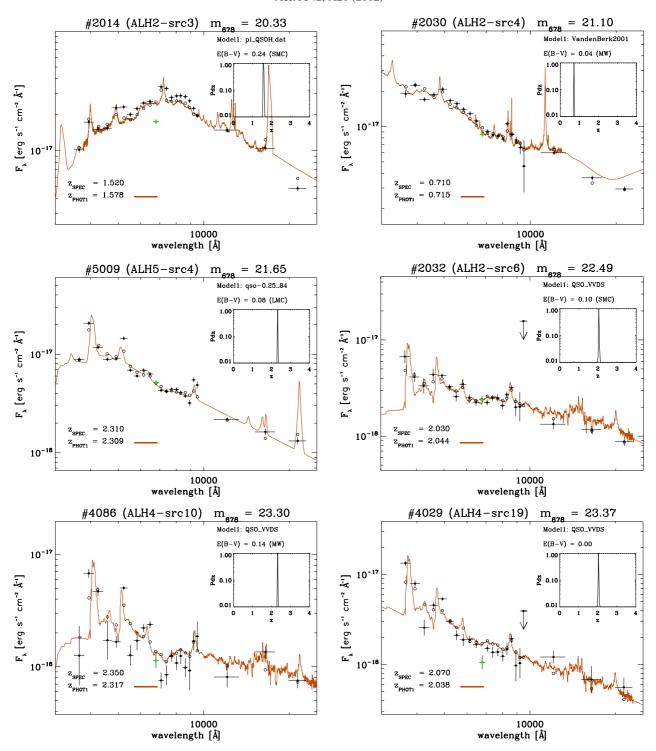


Fig. 4. Examples of best-fit solutions assuming a SMC extinction law for 6 sources covering a wide range of magnitudes ( $\sim 20 \le m_{678} \le \sim 23.5$ ) and spectroscopic redshifts ( $0.7 \le z \le 2.3$ ). Each panel includes the observed photometry, associated errors, and FWHM for each of the 23 ALHAMBRA filter set (black dots, vertical and horizontal error bar respectively). Photometric upper limits are indicated by arrows. The continuous line shows the best-fit solution, while the open circles give the expected magnitude from the model corrected from systematic offsets. Additional info for each source includes: model name, reduced  $\chi^2$ , amount of extinction, the normalized probability distribution as a function of z (Pdz), the spectro-z (and its source catalog), and the best-fit photo-z solution. The title of each panel is labeled with the source ID in the ALHAMBRA catalog and the measured magnitude in the  $m_{678}$  filter (green dot).

170 sources in our BLAGN/QSO sample. Photometric redshifts are generally characterized by both their accuracy and outlier fraction. The accuracy is defined as the standard deviation of  $\Delta z/(1+z_{\rm spec})$ , denoted  $\sigma_{\Delta z/(1+z_{\rm spec})}$ , where  $\Delta z=z_{\rm spec}-z_{\rm phot}$ ,

while the outlier fraction  $(\eta)$  is defined as the fraction of sources with catastrophic solutions (i.e. solutions that are inconsistent with the measured spectro-z). In our analysis, we assumed that a source is an outlier if  $|\Delta z|/(1+z) \ge 0.15$ . This value was

selected a priori to be compatible with the cutoff of similar studies (e.g. Luo et al. 2010; Salvato et al. 2009; Ilbert et al. 2009; Rowan-Robinson et al. 2008). An alternative accuracy estimate that has been used by several authors (e.g. Ilbert et al. 2006; Brammer et al. 2008) is the normalized median absolute deviation (NMAD) defined as

$$\sigma_{\text{NMAD}} = 1.48 \times \text{median} \left| \frac{\Delta z - \text{median}(\Delta z)}{1 + z_{\text{spec}}} \right| \cdot$$

This parameter can be directly compared to the standard deviation of  $\Delta z/(1+z_{\rm spec})$  in the case of normal distributions and has the advantage of being less sensitive to outliers. From now on, we use  $\sigma_{\rm NMAD}$  as our estimate of the photo-z accuracy.

We now discuss our results based on the number of extinction laws considered in the computation, namely either a single (SMC) extinction law (SEL) or multiple (SMC, LMC, Milky-Way, and Calzetti) extinction laws (MEL). Table 4 describes the solutions found for the two sets of extinction laws considered. In the case of a SMC extinction law, we obtained an accuracy of  $\sigma_{\rm NMAD} = 0.009$  with a fraction of outliers of  $\eta \sim 12\%$  (21 out of 170 sources). A comparison between the derived photo-z and the spectro-z is shown in the top panel of Fig. 5. The narrow scatter present for the good fits (green dots) is highlighted by the distribution of the source redshift accuracy that lies in the range  $|\Delta z|/(1+z_{\rm spec}) \le 0.15$  (i.e. no outlier region) and shown in Fig. 6. This distribution is well-represented by a Gaussian with no measurable bias (centered at -0.001) and a  $\sigma$  of  $\sim 0.006$ . Identical results were found when we considered several extinction laws during the minimization process ( $\sigma_{\text{NMAD}} = 0.009, \eta \sim 12\%$ ) but, as we see in the following paragraphs, the MEL approach is able to more accurately reproduce the SED distribution of the BLAGN/QSO population.

Besides the ability to provide precise photo-z's, our analysis allows us to recover the correct SED for most of the sources. Figure 7 presents the distribution of the templates for the MEL best-fit solutions. We did not find sources with stellar templates that have best-fit solutions (i.e.  $\chi^2_{\rm stellar} < \chi^2_{\rm gal-QSO}$ ) and the majority of the sources are best-fitted by pure type-1 QSO templates or QSO hybrid templates (ULIRG/QSO1 template indices #29 and above; Sect. 3.1). When we did not take into account the outlier fraction of the sources, we found that 95.3% of them (142/149) have either a QSO or hybrid-QSO best-fit template, 1.3% (2/149) are fitted by a QSO2 or hybrid-QSO2 template, and 3.4% (5/149) are fitted with a normal or starburst template. Five sources have best-fit solution templates compatible with a non-active SED. A closer look at the ALHAMBRA photometry, the best fit solution, and the observed spectra (when available) revealed that: i) one source might be incorrectly classified as BLAGN since both the spectra and the ALHAMBRA photometry point to an early-type galaxy; ii) one source belongs to the fainter part of the population ( $m_{678} = 23.33$ ) and the associated errors ( $\Delta m > 0.2$ ) have diluted any possible BLAGN signature in the ALHAMBRA photometry; iii) the other 3 sources have optical spectra compatible with galaxy templates with different degrees of starforming and post-starforming activities, i.e. no signs of broad emission and a continuum with a well-defined 4000 Å break, but with ALHAMBRA photometry showing some degree of AGN activity (blue continuum and indications of faint, typical BLAGN line-emission namely of Mg II, C<sub>III</sub> or C<sub>IV</sub> at the spectroscopic redshift of the source). The incorrect solutions found for these 3 sources are probably a consequence of the uncertainties expected from the method, particularly regarding the chosen template database and the absence of any variability correction of the photometry.

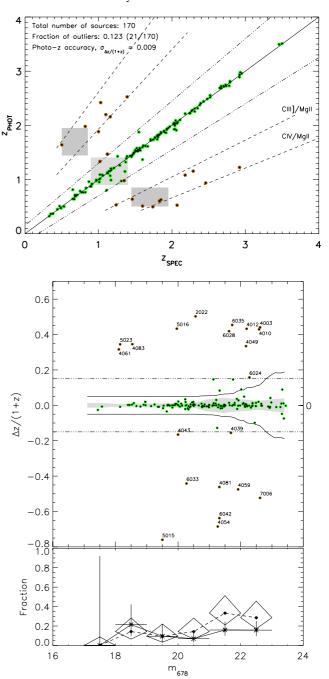
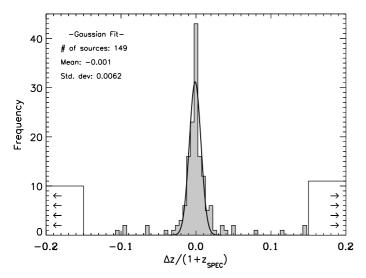
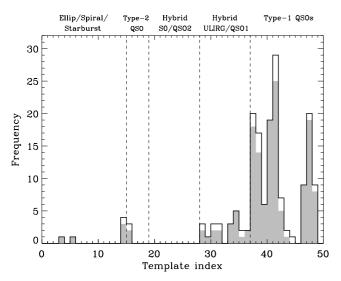


Fig. 5. Photo-z efficiency using several extinction laws (the MEL solution). Top: comparison between the best fit photo-z solution and the measured spectro-z shows a good agreement between the both. The continuous line gives the  $z_{\text{phot}} = z_{\text{spec}}$  relation while the dashed line represent the boundary between good solutions (green dots) and outliers (red, indexed dots) and defined as  $|\Delta z|/(1+z_{\rm spec})>0.15$ . *Central*: distribution of  $\Delta z/(1+z_{\rm spec})$  as a function of the ALHAMBRA magnitude  $m_{678}$ . The mean magnitude error, per magnitude interval of  $\Delta m = 1$ , of the filter A678M is indicated by the continuous lines. The accuracy per magnitude interval ( $\Delta m = 1$ ) is highlighted by a grey shaded area. This accuracy shows a small correlation with apparent magnitude. Bottom: this panel shows the contribution of each magnitude bin  $(\Delta m = 1)$  to the outlier population as filled diamonds connected by a dashed line. The magnitude intervals considered and the associated errors are indicated by the large diamonds. The fraction of outliers with respect to the number of sources in the same magnitude intervals are given by asterisks connected by a continuous line. The magnitude intervals and the associated errors are indicated by the large vertical and horizontal lines. In both cases, errors are assumed to be Poissonian and were calculated following Gehrels (1986).



**Fig. 6.** Uncertainty distribution,  $\Delta z/(1+z)$ , for the 170 BLAGN/QSOs in our sample considering the MEL approach. Non-outlier and outliers are represented by filled and open histograms, respectively. The continuous line represents the best Gaussian fit to the observed distribution of non-outliers. The number of non-outliers (#), the center, and  $\sigma$  of the best-fit Gaussian distribution are indicated.



**Fig. 7.** Spectral energy distribution for the MEL best-fit solutions. Open histogram takes into account all sources, while the shaded histograms consider only the sources with good photo-*z* solutions. We find that none of the ALHAMBRA BLAGN/QSOs is well-represented by a stellar template. Of all the extragalactic templates considered, the majority (95.3%; 142 out of 149) of the sources with good solutions (i.e. no outliers) have best-fit templates compatible with a pure QSO or hybrid QSO/ULIRG template.

As a test of the degeneracy introduced by the chosen template database, we considered an alternative database of only QSOs and hybrid QSO/ULIRG templates (see indices #29–39 in Table 3 and Fig. 3) for the 5 sources with a normal galaxy or starburst best-fit solution. We found that: *i*) for 2 sources we were unable to recover in this case the photo-*z*, casting some doubts on the spectral classification of the sources or an incomplete template database; *ii*) a correct photo-*z* was found for the other 3 sources where hybrid templates with a weaker BLAGN component (10–20%) were selected by the best-fit solution. This last case highlights the degeneracy introduced by the selected template database for certain host and BLAGN luminosity regimes.

For this small fraction of sources (2%; 3/149), the incorrect spectral classification, using the method described here, will be taken into account in any statistical analysis of the BLAGN/QSO population detected in the ALHAMBRA fields to be presented in a forthcoming paper (Matute et al., in prep.).

Furthermore, we note that the photo-z determination described here is able to recover the redshift of the sources in the interval  $2.2 \le z \le 3.6$ , which has been traditionally biased against the selection of QSOs because of their similar colors to F/G stars. Hence, the photometry and the method described here could provide an efficient way of both classifing and deriving a reliable photometric redshifts for BLAGN/QSO candidates pre-selected, for example, by their X-ray flux. The catalog and derived luminosity functions for BLAGN/QSO selected purely based on the ALHAMBRA photometry will be presented in a companion paper (Matute et al., in prep.).

The dependence of our results on redshift, apparent magnitude of the source, and the systematic offsets applied during the photo-*z* computation are described in the following sections. These dependences are similar in the two sets of extinction laws unless otherwise specified.

### 4.1.1. Dependence on redshift

The accuracy of the photo-z results is rather independent of the redshift with the exception of the interval z = [0.9, 1.4] (lightgrey square in Fig. 5a for the SMC results). The presence of only one prominent line (Mg II ) in this interval introduces some aliasing that depends on the intensity of the line and how well is sampled by the ALHAMBRA filters. This small degradation of the solution occurs when the peak of the Mg II line falls within two ALHAMBRA filters. The distribution of the outlier fraction of the sources (Fig. 5, red dots) follows a bimodal behavior around  $z_{\rm spec} \sim 1.4$ . Below this redshift ( $z_{\rm spec} \leq 1.4$ ), the minimization process tends to overestimate the photo-z solutions, while it underestimates them at higher redshifts ( $z_{\text{spec}}$  > 1.4). This effect can be explained by i) the QSO color/redshift degeneracy (i.e. the degree of similarity between the colors at different redshifts; e.g. Richards et al. 2001) and ii) a line misidentification (Croom et al. 2004). These degeneracies, still present in the ALHAMBRA data but to a much lesser extent than for broadband photometry, are highlighted as grey shaded areas and dot-dashed lines in Fig. 5 for the color-color and line misidentification degeneracies. Further details of the origin of these degeneracies are given in Sect. 4.3 where we explore the nature of the outlier fraction of sources.

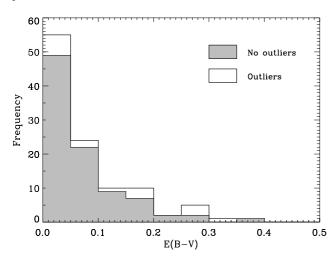
#### 4.1.2. Dependency with apparent magnitude

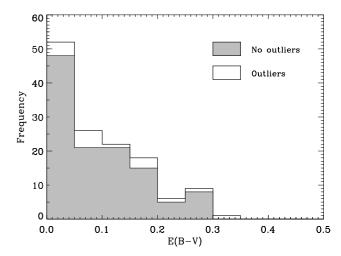
As highlighted in the central panel of Fig. 5, we do not find any dependence of the accuracy on the apparent magnitude of the source but only a clear degradation of the solutions is found at fainter magnitudes ( $m_{678} \ge 22.0$ ) caused by the slightly noisier photometry ( $\Delta m_{678} \sim 0.2$  at  $m_{678} = 23$  as indicated by the continuous line in the central panel of Fig. 5). On the other hand, the outlier fraction shows a moderate correlation with apparent magnitude (bottom panel of Fig. 5), where  $\sim 62\%$  of the outliers have  $m_{678} \ge 21.0$ . Nevertheless, although some outliers might be produced by noisier photometry, other factors might also contribute to the catastrophic failures (see Sect. 4.3).

Table 4. BLAGN/QSO photometric redshift results.

	N	nds + JHK <sub>S</sub>		Medium-bands					
	SEL <sup>(</sup>	a)	MEL	(b)	SEL <sup>(</sup>	a)	$\mathrm{MEL}^{(b)}$		
	No offsets Offsets		No offsets	Offsets	ffsets No offsets		No offsets	Offsets	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	
$\sigma_{ m NMAD}$	0.010	0.009	0.011	0.009	0.013	0.013	0.014	0.011	
$\eta$	15.9	12.3	14.1	12.3	16.4	15.3	19.4	15.3	
Extincted fraction (c)	46.9	61.7	61.6	79.0	45.8	55.6	71.0	81.3	
$\langle E(B-V)\rangle^{(d)}$	0.045	0.058	0.085	0.092	0.037	0.049	0.063	0.085	
QSO1-hybrid fraction <sup>(e)</sup>	92.3	92.6	95.2	95.3	92.2	91.7	94.9	95.1	

**Notes.** <sup>(a)</sup> Results using the SMC extinction law. <sup>(b)</sup> Results using several extinction laws (SMC, LMC, MW, and Calzetti). <sup>(c)</sup> Fraction of sources requiring extinction. <sup>(d)</sup> Mean color excess applied to the extincted sources. <sup>(e)</sup> Fraction of sources with pure QSO1 or hybrid QSO1/IRAS 22491 templates.





**Fig. 8.** Color excess distribution for the sources that required a certain amount of extinction, E(B-V) > 0, to be applied to the best-fit template. *Left*: color excess distribution using only the SMC extinction law. *Right*: color excess distribution using various extinction laws (see Sect. 3.2). Histograms as in Fig. 7.

# 4.1.3. Dependence on photometric offsets

Table 4 reports the improvement in the fit achieved by including the photometric offsets derived from the ALHAMBRA photometry and the template dataset. Although the accuracy is only marginally higher, we found that the greatest benefit is the reduction in the numbers of outliers (from  $\sim 16\%$  to  $\sim 12\%$ ). The same behavior has been previously observed by other authors (e.g. Ilbert et al. 2009).

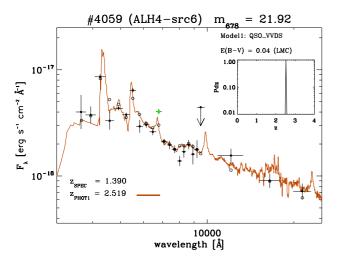
### 4.2. Extinction distribution

The distribution of the color excess E(B-V) required by the bestfit solutions is shown in Fig. 8. Considering only the SMC extinction law (Fig. 8, left), we found that ~62% (92 out of 149) of the non-outlier sources require some dust extinction in their bestfit solution. The mean extinction of the sample is  $\langle E(B-V) \rangle \sim$ 0.06, with the majority of these sources (~53%) having a color excess compatible with the mean Galactic value along the line of sight  $(E(B - V) \le 0.05)$ . Only 5 sources require extinctions in the range  $0.2 \le E(B-V) \le 0.4$ . The solutions obtained using the MEL approach required a slightly larger fraction of extincted sources (79%) with a mean color excess of  $\langle E(B-V) \rangle \sim 0.09$ . A significant fraction of sources (~41%) with small extinctions (E(B-V) < 0.05) was also found in this case. We note here that, since several templates in our database are already extincted, the derived values of E(B - V) should only be considered as lower limits when these template are chosen by the best-fit solution.

The presence of dust-extincted QSOs is no surprise as the SDSS survey has established the existence of a non-negligible fraction of QSOs with spectral indices ( $f_{\nu} \propto \nu^{\alpha}$ ) redder than  $\alpha = -1$  with extinctions as high as  $E(B-V) \sim 0.5$  (Gregg et al. 2002; Richards et al. 2003). The extinction values found in this work for BLAGN/QSO are in good agreement with the extinction interval derived by Richards et al. (2003; E(B-V) = [0.07-0.135]) in order to reproduce the spectral indices of red QSOs using templates of QSOs with normal colors from the SDSS. A detailed analysis of the selection effects introduced by intrinsic dust extinction will be carried out for the future catalog release of QSOs detected by the ALHAMBRA survey (Matute et al., in prep.).

#### 4.3. Nature of the outliers

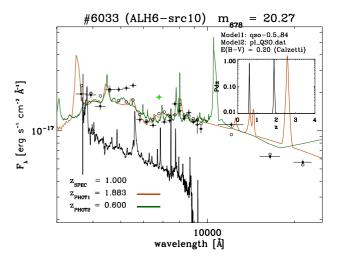
To fully characterize the photo-z estimate for the ALHAMBRA QSOs, it is fundamental to understand the reasons for an incorrect photo-z determination. In the following, we describe the photometry and nature of the  $\sim 12\%$  of the sources (21/170) with inaccurate photo-z determinations in an attempt to infer the reasons for the incorrect solutions. The outlier best-fit templates (Fig. 7, open fraction of the histogram), extinction values (Fig. 8, open fraction of the histogram), and redshift distribution (upper panel, Fig. 5) are similar to those of the remaining population. The most probable reasons for the catastrophic failures are enumerated in the following paragraphs. We only discuss the



**Fig. 9.** Example of a source with a dubious spectro-z of 1.39. The ALHAMBRA photometry and errors, represented by the black dots and crosses, provide a photo-z solution (continuous line) of 2.53 with peak emission-lines from  $L_a$ , C III], and C IV clearly visible at ~4300, ~5400 and ~6700 Å respectively. Lines and symbols as in Fig. 4. The spectra of this source is currently unavailable to the public.

MEL fit approach as it offers the best results, but similar conclusions can be drawn from the SEL approach.

- 1) The less precise photometry of fainter sources. The apparent dependence of the outlier fraction on magnitude has already been discussed in Sect. 4.1.2. This dependence is almost expected as the larger photometric errors of these fainter objects (continuous line in the central panel of Fig. 5) broadens the Pdz distribution, increasing the number of peaks and directly influencing the photo-z results. Nevertheless, only 2 outliers ( $\sim 10\%$  of all the outliers; Fig. 5 #'s 4049 & 6024) have large enough photometric uncertainties ( $\Delta m > 0.2$ ) that can explain their incorrect photo-z solution.
- 2) Emission-line misclassification. Eight outlier solutions (38% of all the outliers; Fig. 5 #'s 2022, 4010, 4061, 5015, 5023, 5016, 6028 and 6035) misclassify either a single or pair of emission lines depending on the redshift of the source and on how intense and well-sampled the lines are by the ALHAMBRA photometry (see Sect. 4.1.1). The expected source distribution for single line misclassifications (confusion of the CIII) and C IV lines with Mg II and viceversa) is outlined in the top panel of Fig. 5 by the dashed lines. The emission-line pairs Mg II – H $\beta$ and C<sub>III</sub> – Mg II can be confused in the redshift intervals  $z \sim$ [0.6-0.9] and  $z \sim [1.5-1.9]$  owing to the limited resolution of the ALHAMBRA spectra (i.e. the ability to resolve the line given its intensity and position with respect to the ALHAMBRA filters). This latter source of confusion is highlighted as the dark grey areas in the top panel of Fig. 5. For 6 out of the 8 sources, we found secondary solutions in agreement with the spectro-z. For these sources, additional a priori information would be needed in order to favor one solution over another. A simple a posteriori condition that weights the solution at each redshift (Pdz), given the source magnitude, was derived from known luminosity functions of optically selected QSOs. We found that this approach does not always reduce the fraction of outliers in our sample while, if applied to the whole ALHAMBRA survey, may intro-
- 3) The possibility of an incorrectly assigned spectro-z. The ALHAMBRA photometry and the solutions found for 3 sources (~14% of all the outliers; Fig. 5 source #'s 4059, 4081 and 7006) seem to indicate that an incorrect spectroscopic redshift has been



**Fig. 10.** Example of an object with a strange ALHAMBRA SED probably caused by intrinsic variability during the time in which photometry was taken. Lines and symbols as in Fig. 4. We also indicate with a green line a possible secondary solution with  $z_{\rm PHOT}=0.6$ . As a comparison, we include the observed spectra with a continuous black solid line. Since no flux calibration is provided with the observed spectra, we scale the flux accordingly to fit the plot scale. The observed spectra has been smoothed using a 20 pixel box.

assigned. An example of one of these sources is shown in Fig. 9, where the ALHAMBRA low-resolution spectra show a welldefined power-law continuum with signs of two or more intense emission-lines that do not correspond to the assigned spectro-z. A low S/N spectra and/or limited wavelength coverage are typical causes of an incorrect assignment of spectroscopic redshifts (Fernández-Soto et al. 2001). Two out of three sources are located in the COSMOS field. These sources spectro-z come from VIMOS/VLT observations (Brusa et al. 2010) that are not included in the public release of the zCOSMOS database. Some degeneracy in the spectro-z is expected given the limited wavelength range covered by the VLT/VIMOS observations of  $\lambda \sim$ [5500, 9500] Å. This means that just a single broad emission-line will be visible in certain redshift intervals (e.g. confusion may arise between Mg II at  $z \sim [0.8, 1.5]$  and C<sub>III</sub> at  $z \sim [2.2, 2.6]$ ), as seems the case for these 3 outliers. Although further confirmation of their true redshifts is required, these sources prove how precise photo-z can complement spectro-z making them an invaluable tool in modern observational cosmology.

4) Intrinsic variability. Seven sources (~33% of all the outliers; Fig. 5 #'s 4003, 4012, 4039, 4043, 4054, 6033 and 6042) have unusual ALHAMBRA SEDs that are incompatible with the template database, indicating that variability is probably playing an important role. None of the sources display signs of either blending or a close companion that might contaminate their photometry. Figure 10 shows one of these sources and illustrates the disagreement in the continuum and emission features between the ALHAMBRA photometry and the observed spectra. An estimate of the intensity of the variability can be obtained from the 5 sources within the COSMOS field using the catalog published by Salvato et al. (2011). All 5 sources display flux variability of  $\Delta m > 0.35$  and in some cases as large as  $\Delta m \sim 0.80$ . The importance of the variability correction for the photo-z computation of BLAGN and QSOs has been reported in the past by several authors (Wolf et al. 2004; Salvato et al. 2009). Unfortunately, owing to the observing strategy of ALHAMBRA, it is impossible to set the photometry to a common epoch.

**Table 5.** Photo-z accuracy comparison in different cosmological fields.

#### **GALAXIES**

Survey	# Sources <sup>a</sup>	# Bands <sup>b</sup>	λ-range	Depth	Code	# Temp. <sup>c</sup>	$\sigma$	$\eta^d$	Ref.e
COSMOS	4148	30 (12)	UV–IRAC	$i_{AB}^* \le 22.5$	LePhare	31	0.007	<1 (0.15)	(1)
GOODS-N/HDF-N	~130	7(-)	UBVIJHK	$I_{814} \leq 25$	BPZ	6	0.06	~1.0	(3, 4)
MUSYC (all)	2551	32 (18)	Opt– $8.0 \mu m$	$R \leq 26$	EAzY	semi-analytical	~0.010	~5.0 (0.10)	(6)
SWIRE (all)	5982	6-10 (-)	$0.36-4.5 \mu \text{m}$	<i>r</i> < 23.5	ImpZ-2	9	0.035	$\sim 1.0 (0.15)$	(7)
COMBO-17	813	17 (12)	$0.35-0.93 \mu \mathrm{m}$	R < 24	_	PEGASE lib.	~0.07	$\sim 2.0 (0.15)$	(8)
NDWFS-Boötes	14448	13 (-)	UV-Opt-NIR-MIR	R < 26	$\chi^2$ min.	$4  \mathrm{LRT}^g$	0.041	5.0	(10)
Lockman Hole	209	21 (-)	FUV-Opt-NIR	$R_{\rm c} < 22.5$	LePhare	31	0.034	10.0 (0.15)	(11)

				AGN					
XMM-COSMOS <sup>f</sup>	236	30 (12)	UV-IRAC	$i_{AB}^* \le 22.5$	Le Phare	30/31	0.013	7.2 (0.15)	(2)
$C$ - $COSMOS^f$	236	30 (12)	UV-IRAC	$i_{AB}^* \leq 22.5$	Le Phare	30	0.011	5.1 (0.15)	(2)
MUSYC (X-ray)	236	32 (18)	Opt $-8.0\mu\mathrm{m}$	$R \leq 26$	EAzY	$1^g$	0.012	12.0 (0.12)	(6)
CDF-S	446	35 (18)	UV $-8.0\mu\mathrm{m}$	$z \leq 26$	ZEBRA	265	0.01 - 0.06	1.4-8.1 (0.15)	(5)
SWIRE (QSO)	158	6-10 (-)	$0.36$ - $4.5 \mu \mathrm{m}$	r < 23.5	ImpZ-2	9	0.093	~33.0 (0.10)	(7)
COMBO-17 (QSO)	52	17 (12)	$0.35 – 0.93 \mu \mathrm{m}$	R < 24	_	1	0.007	17.3 (0.10)	(8,9)
NDWFS-Boötes	5347	13 (-)	UV-Opt-NIR-MIR	R < 26	$\chi^2$ min.	$4  \mathrm{LRT}^g$	0.05 - 0.18	5.0	(10)
Lockman Hole	90	21 (-)	FUV-Opt-NIR	$R_c < 22.5$	LePhare	30	0.069	18.9 (0.15)	(11)
ALHAMBRA	170	23 (20)	Opt–NIR	$m_{678} \le 23.5^h$	LePhare	50	0.009	12.3 (0.15)	(12)

**Notes.** <sup>(a)</sup> Number of sources with spectroscopic redshift used for photo-z calibration. <sup>(b)</sup> Maximum number of photometric bands used for photo-z determination. In parenthesis, the number of those filters that have a narrow or medium passband. <sup>(c)</sup> Number of extragalactic templates used for photo-z determination. <sup>(d)</sup> Percent fraction of outliers. Outlier threshold criteria defined as  $|\Delta z|/(1+z_{\rm spec})$  in parenthesis. <sup>(e)</sup> References: (1) = Ilbert et al. (2009); (2) = Salvato et al. (2011); (3) = Benítez et al. (2000); (4) = Coe et al. (2006); (5) = Luo et al. (2010); (6) = Cardamone et al. (2010); (7) = Rowan-Robinson et al. (2008); (8) = Wolf et al. (2004); (9) = Wolf et al. (2008); (10) = Assef et al. (2010); (11) = Fotopoulou et al. (2011); (12) = this work. <sup>(f)</sup> We refer here to the sub-sample of point-like/variable sources from the total XMM COSMOS catalog (the *QSOV* sample). <sup>(g)</sup> Low Resolution Templates. The photometric redshift code allows for an interpolation between all templates (galaxy + AGN). <sup>(h)</sup> This magnitude corresponds to roughly the broadband Sloan filter  $r \sim 24$ .

For only one source (#4083) does its incorrect photo-z solutions seem unclear as it has a fairly bright ( $m_{678} = 18.54$ ) power-law spectrum with low variability ( $\Delta m < 0.2$  from Salvato et al. 2011).

In summary, we found that  $\sim 10\%$  of the outliers can be explained by their less precise photometry,  $\sim 38\%$  are caused by emission-line misclassification,  $\sim 14\%$  shown clear evidence of an incorrectly assigned spectro-z, and the remaining  $\sim 33\%$  have significant intrinsic variability.

### 4.4. Performance comparison with other surveys

Our results are compared to those already published in the literature in other cosmological fields. Table 5 summarizes the main characteristics of the photo-z accuracy for several relevant cosmological surveys, including the wavelength range covered, number of photometric bands used, number of sources in the spectroscopic sample used to calibrate the photo-z, the depth of the photometry, the photometric code used, the number of templates, the final precision in terms of the accuracy  $(\sigma)$ , and the fraction of outliers  $(\eta)$ . The table has been divided into one section for the galaxy and one for the AGN results. This highlights the accuracy differences between the two populations, as well as the significantly larger (by factors of  $\sim 3-10$ ) spectroscopic samples available to the former because AGN represent only <10% of the extragalactic population. We note here that the table highlights simply the differences in the wavelength coverage and filter type used by each survey. The reader must be aware of the caveats in this comparison, namely the different depths, source populations, methodology, spectroscopic sample used, and the computation of the accuracy estimates.

The benefit of a continuous optical coverage with mediumband photometry is clearly illustrated in Table 5, where we

compare broadband surveys such as SWIRE and HDF-N with medium-band surveys like MUSYC, COMBO-17, and ALHAMBRA itself. The precision of the results are particularly higher for the BLAGN population, where the accuracy increases by a factor of  $\sim 10$  and the fraction of outliers decreases by a factor of 3 or more.

A more interesting comparison is that between ALHAMBRA and the surveys that include a certain number of medium optical filters and different wavelength coverages. Since the ALHAMBRA survey is a natural successor to the COMBO-17 survey (Wolf et al. 2003), it is mandatory to compare the performance of its photometric system with that of COMBO-17 in the E-CDFS field. We found that, for BLAGN/QSO, ALHAMBRA is only marginally worse than the latest recalibration of the COMBO-17 data (Wolf et al. 2008) in terms of accuracy (0.009 vs. 0.007). On the other hand, it has a smaller fraction of outliers (12.3% vs. 17.3%). The narrower medium-band passbands of COMBO-17 (FWHM of ~200 Å vs. ~300 Å) may be held responsible for the slight accuracy advantage, but also introduce a highly redshift-dependent selection function owing to the non-continuous optical coverage of the filters, as in the case of ALHAMBRA. This continuous, non-overlapping coverage of the optical by the ALHAMBRA filters, together with the addition of NIR broadband photometry, has helped to reduce the number of catastrophic failures. Furthermore, our results are obtained without applying the variability correction made to COMBO-17 data.

As part of the Multiwavelength Survey by Yale-Chile (MUSYC; Gawiser et al. 2006), photo-*z* estimates results were published by Cardamone et al. (2010) in the E-CDFS using the deeper, more extensive, broad-band photometry and also including photometry from 18 medium-band filters taken with the Subaru telescope. The performance comparison between the

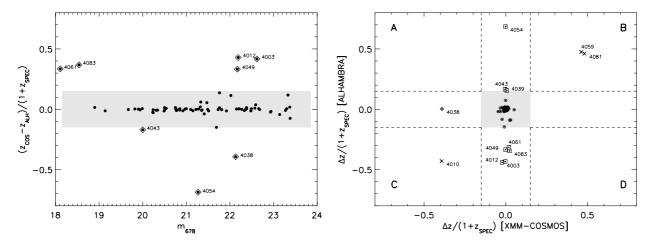


Fig. 11. Comparison of the photo-z solutions for the 77 common sources in the XMM-COSMOS field. *Left*: differences in the photo-z solutions found by the ALHAMBRA and COSMOS photometry as a function of the visual magnitudes in the ALHAMBRA filter A678M. Both surveys agree for ~90% of the sources when  $(z_{PHOT-COS} - z_{PHOT-ALH})/1 + z_{SPEC} \le 0.15$ , where  $z_{PHOT-COS}$  and  $z_{PHOT-ALH}$  are the photo-z solutions found in the COSMOS and ALHAMBRA surveys respectively. *Right*: comparison of the source-by-source photo-z accuracy for both surveys. The threshold limit for outliers,  $|\Delta z|/(1+z_{spec}) \le 0.15$ , is indicated by vertical and horizontal dashed lines for the COSMOS and ALHAMBRA surveys, respectively. The central grey square represent the region where the two surveys agree, while sources in any of the exterior 4 quadrants (A, B, C, and D) have wrong photo-z solution in both COSMOS and ALHAMBRA (crosses). Sources within the vertical or horizontal stripes, defined by the dashed lines, and not within the central square have either i) good-COSMOS and poor-ALHAMBRA solutions (squares) or ii) good-ALHAMBRA and poor-COSMOS solutions (diamonds).

ALHAMBRA and MUSYC X-ray (AGN-dominated) population yields identical values. This result is unsurprising given that the definition of the MUSYC medium-band photometric system is very similar to that of ALHAMBRA, i.e. continuous, nonoverlapping medium-band filters. Nevertheless, we note that, given the nature of the E-CDFS observations, the results obtained by MUSYC extend to much fainter optical magnitudes  $(R \sim 26)$ . Photometric redshifts estimates are also available in this field for the sources detected by the *Chandra* 2 Ms exposure in the 436 arcmin<sup>2</sup> CDF-S (Luo et al. 2010). Although the highest accuracy and outlier fraction found by the authors is as low as 0.01 and 1.4% respectively, they also found that the strong dependence of this result on the spectroscopic sample, used to correct their SED library, could increase the dispersion and outlier fraction of the result to  $\sigma_{\text{NMAD}} = 0.059$  and  $\eta = 8.1\%$ . A larger dispersion would be expected as their analysis also extends to a much fainter population (z < 26) as a result of the depth of the *Chandra* observations ( $\sim 2 \times 10^{-17} \,\mathrm{erg}\,\mathrm{cm}^{-2}\,\mathrm{s}^{-1}$  in the 0.5-2.0 keV band). The Luo et al. results have been included under the AGN section of Table 5, although given the depth of the Chandra observations, an important fraction of sources is expected to be dominated by intrinsically faint AGN, starbursts, or even normal galaxies.

The COSMOS survey (Scoville et al. 2007) provides the largest number of BLAGN/QSOs of our ALHAMBRA sample thanks to its extensive spectroscopic follow-up (Lilly et al. 2007; Brusa et al. 2010, and references therein). This spectroscopic follow-up, coupled with the vast multiwavelength information available in the field, has allowed the computation of precise photometric redshift for galaxies and AGN (Ilbert et al. 2009; Salvato et al. 2011). Our photo-z determination and that of COSMOS share a similar methodology, the use of the same photometric code (*LePhare*) as well as several templates in the dataset. A direct comparison is therefore possible between their findings and our results for the BLAGN/QSO population (the *QSOV* sample in Salvato et al. 2011), allowing us to further quantify the ALHAMBRA results through: i) the comparison

of the photometric system of both surveys, i.e. a COSMOS 30 filter-set with a significant number of broad-band filters, including NUV/GALEX and mid-IR/IRAC photometry but also 12 medium-band filters and 2 narrow-band filters, against the 23 ALHAMBRA filter-set dominated by optical medium passbands but with no info in the NUV or mid-IR; *ii*) the impact of the variability correction applied to the COSMOS data.

We found in general good agreement between our photo-z and the fraction of BLAGN/QSOs published by Salvato et al. (2011) located within the ALHAMBRA field (77 sources in  $\sim$ 12.5% of the COSMOS area). The results of this comparison are presented in Fig. 11. The left panel shows the overall agreement between both surveys, with 90% of the sources (69/77) lying within  $(z_{PHOT-COS} - z_{PHOT-ALH})/1 + z_{SPEC} \le 0.15$  over the entire magnitude range of the sample. However, this comparison does not establish whether or when any of the two photometric estimates provide an accurate photo-z. This information is given in the right panel of Fig. 11, where we compare the accuracy found by COSMOS and ALHAMBRA source by source. The threshold limits for outliers ( $\sigma_{NMAD} \leq 0.15$ ) are represented by vertical and horizontal dashed lines for the COSMOS and ALHAMBRA, respectively. The central grey square contains the sources for which the two surveys photo-z estimates agree with the measured spectro-z (~84%; 65/77). For 8 of the 12 sources in disagreement, COSMOS provides a more accurate solution (squares in Fig. 11), while 1 source has a more reliable estimate in ALHAMBRA (diamond). Of the 8 sources with more accurate COSMOS solutions, 5 need a strong variability correction according to Salvato et al. (2009; see Sect.4.3), which may explain our wrong estimates, 2 sources have the line misclassification uncertainty described in Sect. 4.3 (#4061 and #4083) and another one has large photometric uncertainties in ALHAMBRA (#4049). Finally, in both surveys, 3 sources have photo-z estimates that inconsistent with their spectro-z (quadrants B and C in Fig. 11). We note that these photo-z estimates are very similar for 3 of the sources (# 4059, 4081 and 4010) and that the redshifts of these sources are based on a single line spectrum. For

two of them, there seems to be an incorrect measurement of the spectro-*z* (see Sect. 4.3). For the third source, the photo-*z* solution is degenerate, showing two peaks of similar intensity in the Pdz distribution, and the method selects the incorrect photo-*z*.

To summarize, we observe that the accuracy of the ALHAMBRA photometric redshift determination for the BLAGN/QSO population is, as expected, much better than any broad-band survey and similar to any recent photometric survey including medium passband filters. This result is obtained without the advantage of the larger wavelength coverages of other surveys and thanks to the ALHAMBRA filter selection in the optical and NIR. The fraction of outliers is comparable to or better than other cosmological surveys that include no variability correction. The importance of the variability correction for BLAGN/QSOs (Wolf et al. 2004; Salvato et al. 2009) is highlighted by our larger outlier fraction (by a factor of ~2) compared to a survey such as COSMOS, whose observation strategy allowed all its photometry to be set to a common epoch.

# 4.5. The impact of the NIR photometry

The need for NIR photometry in order to increase the accuracy of photo-z and reduce the number of catastrophic failures for normal and starburst galaxies has been demonstrated by several authors (Connolly et al. 1997; Fernández-Soto et al. 1999; Rowan-Robinson et al. 2003; Ilbert et al. 2006). The subsequent improvement (with an increase in accuracy and a reduction in the outlier fraction by factors of  $\sim 2-3$ ; Ilbert et al. 2006) is caused by these photometric bands providing a tighter constraint of photoz solutions as they sample the peak emission of the old stellar population ( $\sim 1 \,\mu \text{m}$  rest-frame) in the  $z \sim [0,1]$  redshift range. At redshifts above  $z \sim 1.5-2$ , the peak stellar emission moves out the wavelength range covered by the JHK<sub>S</sub> filters and longer wavelength photometry (e.g. Spitzer/IRAC) is required to sample this emission. In the case of the AGN population, Salvato et al. (2009, 2011) illustrated that, when only broad-band imaging is available, sufficiently high photo-z precision and an outlier fraction suitable to scientific analysis can only be obtained with the addition of NIR photometry.

We investigated here the importance of NIR photometry to the photo-z solutions of BLAGN and QSOs when medium-band photometry is available in the optical. To do so, we proceeded as described in Sect. 3 without using the J, H, and  $K_S$  broadband filters. The results of the analysis are summarized in Table 4 (Cols. #5 to #8) for the SEL and MEL solutions. We found that the impact of the NIR photometry is negligible in terms of accuracy (with a marginal decrease of 0.2-0.3%) but does have influence on the fraction of outliers, which increases by 3-5% depending on the set of extinction laws considered during the fit. The larger outlier fraction is dominated by sources with degenerate solutions (showing two or more peaks in the Pdz distribution) that can be constrained by the NIR photometry. On the other hand, the distribution of the SEDs and the required extinction is also very similar to the solution with and without  $JHK_S$  photometry. This result is important to unveiling and characterizing the BLAGN population of future very large ALHAMBRA-like optical photometric surveys such as the JPAS<sup>15</sup> survey or to planning medium-band optical photometric follow-ups to characterize the population of the all-sky X-ray survey to be carried out by the future eROSITA<sup>16</sup> mission (Cappellutti et al. 2011), as detailed below.

We conclude that, although the use of NIR photometry helps us to alleviate the fraction of outliers, its importance for BLAGN/QSO photo-z determination (in the z=[0,4] redshift range) is significantly smaller than for the normal and starburst population when a continuous coverage of the optical with medium-band photometry is available. Nevertheless, the importance of  $JHK_{\rm S}$  photometry obviously increases with redshift and in particular at z>5, where the limited number of optical detections due to the continuum depression bluewards of Ly $\alpha$  make the NIR bands necessary to constrain the continuum slope of BLAGN/QSOs and their photo-z solutions.

#### 4.5.1. A practical case

In the future, several surveys will provide large samples of BLAGN and QSOs. One of these surveys is to be carried out by the eROSITA mission. eROSITA will map all the sky more than one order of magnitude deeper in X-ray flux ( $F[2-10\,\mathrm{keV}]\sim10^{-13}\,\mathrm{erg\,cm^{-2}\,s^{-1}}$ ) than the previous ROSAT All Sky Survey. The deep part of the survey will cover  $\sim200\,\mathrm{deg^2}$  down to a flux of  $F[2-10\,\mathrm{keV}]\sim4\times10^{-14}\,\mathrm{erg\,cm^{-2}\,s^{-1}}$ . In total, the eROSITA mission is expected to discover more than  $10^6$  new AGN including large fractions of BLAGN and QSOs given the survey flux limits. To aid the follow-up of the AGN population uncovered by eROSITA and, in order to obtain reasonable photo-z solutions ( $\sigma_{\rm NMAD}\sim0.08$  and  $\eta\sim22\%$ ), Salvato et al. (2011) discussed the need for at least JHK photometry when only 4–5 broad bands are available in the optical, such as those provided by the very wide-field surveys LSST<sup>17</sup> and Pan–STARSS<sup>18</sup>.

Assuming an ALHAMBRA-like survey covering the entire sky, we can estimate the number of BLAGN/QSOs that could be photometrically identified in eROSITA following the methodology described here. For this purpose, the XMM-COSMOS field serves as a benchmark of the accuracy achievable with such an approach by cutting the XMM-COSMOS X-ray catalog (Brusa et al. 2010) to the fluxes to be reached by the eROSITA all-sky and deep surveys as well as the final magnitude cutoff of the ALHAMBRA photometry ( $r \sim 25$ ). This X-ray selection yields a total of 65 (56 with spectro-z) sources within the ALHAMBRA-COSMOS region for the deep selection and 24 (23 with spectro-z) for the shallow all-sky selection. Photo-z solutions were computed for these sources using the ALHAMBRA photometry and the results are presented in Fig. 12. The photo-z accuracies obtained ( $\sigma_{NMAD} = 0.013$ ,  $\eta$  = 8.9% for eROSITA-deep;  $\sigma_{\text{NMAD}}$  = 0.012,  $\eta$  = 4.3% for eROSITA-shallow) are significantly higher than those for broadband photometry and similar to the results discussed in Sect. 4. The spectroscopic sample is dominated by BLAGN/OSOs (82%, 46 out of 56) for which the ALHAMBRA photometry is able to recover a correct BLAGN/QSO classification (templates from #29 to #49 in Fig. 3) for 78% (36/46) and 90% (17/19) of the deep and shallow samples, respectively. The extrapolation of this efficiency from the ALH-4/COSMOS area (0.25 deg<sup>2</sup>) to the eROSITA deep (200 deg<sup>2</sup>) and all-sky extragalactic (20000 deg<sup>2</sup>) surveys show that an ALHAMBRAlike photometric survey can select and provide high accuracy photo-z solutions for more than  $4 \times 10^4$  and  $1 \times 10^6$  BLAGNs, respectively.

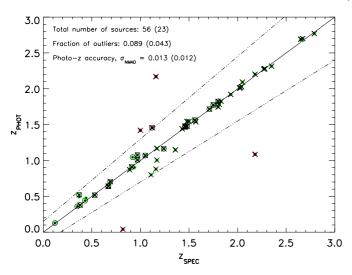
Unfortunately, the telescope time that would be required to carry out a survey such ALHAMBRA, even in the smaller deep regions of eROSITA, is too long for any publicly available

<sup>15</sup> http://j-pas.org/

<sup>16</sup> http://www.mpe.mpg.de/erosita/

<sup>17</sup> http://www.lsst.org/

<sup>18</sup> http://pan-starss.ifa.hawaii.edu



**Fig. 12.** Photometric and spectroscopic redshift comparison for the ALHAMBRA/XMM-COSMOS sources with eROSITA deep survey fluxes ( $F[0.5-2\,\mathrm{keV}] > 4\times10^{-15}\,\mathrm{erg\,cm^{-2}\,s^{-1}}$ ). Symbols color-coded as in Fig. 5. Open circles indicate the sources with a X-ray flux above  $F[0.5-2\,\mathrm{keV}] > 4\times10^{-15}\,\mathrm{erg\,cm^{-2}\,s^{-1}}$  (eROSITA all sky). Crosses highlight sources with spectroscopic BLAGN classification, while open-squares indicate which sources are classified as such with the ALHAMBRA photometry.

observatory, i.e. the time to execute an ALHAMBRA-like survey in 200 deg<sup>2</sup> will be ~10 times longer than that of ALHAMBRA itself, roughly 40 years. On the other hand, a dedicated telescope facility optimized for large-area photometric surveys would do the job in a fraction of the time. This is the case of the planned Javalambre PAU (Physics of the Accelerating Universe) Astrophysical Survey (JPAS, Benítez et al. 2009). This photometric survey, will be carried out at the Javalambre observatory with a 2.5 m telescope and a 5 deg<sup>2</sup> FOV camera, and will sample 8000 deg<sup>2</sup> of the northern sky over four years, starting in late 2013. The JPAS survey will take the photo-z precision to the next level with an expected accuracy of  $\sigma = 0.003$ thanks to its 54 narrow-band optical filters (FWHM  $\sim 100 \text{ Å}$ ). The classification and photo-z estimates of BLAGN and QSOs will be significantly higher in the common region covered by JPAS and eROSITA with respect to ALHAMBRA. This is due to the narrower JPAS filter set and its ability to correct for variability. On the basis of the above ALHAMBRA/eROSITA results, we expect JPAS to select and provide very accurate photo-z for at least  $4 \times 10^5$  BLAGN/QSOs in the JPAS/eROSITA common area.

### 5. Conclusions and future work

We have explored the ability of the ALHAMBRA survey photometry to assign very accurate photometric redshifts to a population of BLAGNs and QSOs. We have achieved a precision better than 1% using a catalog of 170 spectroscopically identified BLAGN/QSO in the ALHAMBRA fields. This precision is similar to the previously published photo-z accuracy for BLAGN/QSOs in surveys that make use of medium-band optical photometry. This has been possible despite the limited wavelength coverage of ALHAMBRA relative to other surveys and thanks to its photometric system definition (consisting in 20 continuous, non-overlapping optical medium-band filters plus the 3 NIR broadbands J, H, and  $K_s$ ).

We have used the publicly available code *LePhare* to derive our photo-*z* solutions by means of fitting our photometry to a template database of normal and starburst galaxies, type-1/2 Seyfert, QSOs, and stars. Our treatment has included a correction for systematic offsets between the different photometric bands and the template database, Galactic extinction, absorption by IGM, and the possibility of intrinsic reddening by adopting various extinction laws. In addition to the excellent accuracy of out photo-*z*, our analysis has demonstrated that:

- 1. The medium-band filter set used by the ALHAMBRA photometry is able to detect the emission and absorption features that characterize QSO optical spectra in the redshift interval  $0 < z \le 4$ .
- 2. We have been able to easily differentiate QSO emission from stellar emission over the entire QSO redshift range from 0 to 3.
- 3. In the redshift interval  $0 < z \le 4$  and  $m_{678} \le 23.5$ , we have characterized the nature of 87.7% of the sources providing a correct SED type and robust photo-z. The fraction of outliers (12.3%) shows a clear correlation with magnitude with ~70% of the outliers being located at  $m_{678} > 21.0$ .
- 4. The most probable reasons for our fraction of outliers are: *i*) the faintness or poor photometric quality of some sources, *ii*) line misclassification, *iii*) the intrinsic variability of the AGN population (for which the ALHAMBRA photometry applied no correction), and *iv*) the possibility of an incorrect spectro-*z* assignment owing to the limited wavelength coverage of the spectra of some objects.
- 5. Near-IR photometry is not fundamental to constrain the photo-z solutions of BLAGN and QSOs, at least in the redshift interval 0 < z < 4, if the optical regime is covered by a continuous medium-band filter set such as that of ALHAMBRA. This result is relevant to the design of future optical follow-ups of surveys with a large fraction of BLAGN, as in the case of either X-ray or radio surveys.

We therefore conclude that the analysis performed here validates the feasibility and accuracy of the photo-z determination for a large number of sources with the ALHAMBRA limited (but well-defined) set of filters. In the particular case of BLAGN and QSOs, our methodology and results suggest the potential ability of the ALHAMBRA photometry to detect these sources and build a large and unbiased BLAGN/QSO database. The publication of such a catalog as well as the precise estimate of its inherent incompleteness necessary to derive meaningful statistical properties (e.g. number counts and luminosity functions) are left to a forthcoming paper.

Acknowledgements. The authors will like to thank Mara Salvato for her helpful advice and for providing templates, solution details, and variability corrections for the photo-z determination of XMM-Newton sources in the COSMOS field. This work has made use of the TOPCAT tool (Taylor 2005). We thank Cécile Cartozo for the careful reading of this manuscript and an anonymous referee for constructive comments and helpful suggestions that improved the quality of this paper. Part of this work was supported by Junta de Andalucía, through grant TIC-114 and the Excellence Project P08-TIC-3531, and by the Spanish Ministry for Science and Innovation through grants AYA2006-1456, AYA2010-15169, AYA2010-22111-C03-02, and AYA2011-29517-C03-01.

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