Photometric redshifts for the CFHTLS T0004 Deep and Wide fields*

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ABSTRACT

Aims. We compute photometric redshifts in the fourth public release of the Canada-France-Hawaii Telescope Legacy Survey. This unique multi-colour catalogue comprises $u’, g’, r’, i’, z’$ photometry in four deep fields of $1\text{ deg}^2$ each and $35\text{ deg}^2$ distributed over three Wide fields.

Methods. Our photometric redshifts, computed using a template-fitting method, are calibrated with a large catalogue of 16,983 high-quality spectroscopic redshifts from several spectroscopic surveys.

Results. From the comparison with spectroscopic redshifts, we find a photometric redshift dispersion of 0.028 and an outlier rate of 3.5% in the Deep field at $i’_{AB} < 24$. In the Wide fields, we find a dispersion of 0.036 and outlier rate of 2.8% at $i’_{AB} < 22.5$. Beyond $i’_{AB} = 22.5$ in the Wide fields the number of outliers rises from 5% to 10% at $i’_{AB} < 23$ and $i’_{AB} < 24$ respectively. For the Wide sample, we find the systematic redshift bias keeps below 1% to $i’_{AB} < 22.5$, whereas we find no significant bias in the Deep field. We investigated the effect of tile-to-tile photometric variations and demonstrate that the accuracy of our photometric redshifts is reduced by at most 21%. We separate stars from galaxies using both the size and colour information. Applying our star-galaxy classifier we reduce the contamination by stars in our catalogues from 50% to 8% at $i’_{AB} < 22.5$ in our field with the highest stellar density while keeping a complete galaxy sample. Our CFHTLS T0004 photometric redshifts are distributed to the community. Our release include 592,891 ($i’_{AB} < 22.5$) and 244,701 ($i’_{AB} < 24$) reliable galaxy photometric redshifts in the Wide and Deep fields, respectively.

Key words. Photometric redshifts – cosmology – galaxies

1. Introduction

It is now evident that the exploration of large scale structure and the high-redshift Universe with the Canada France Hawaii Telescope Legacy Survey (CFHTLS) requires precise magnitudes and redshifts for millions of sources (Benjamin et al. 2007, Parker et al. 2007, McCracken et al. 2008, Fu et al. 2008, Bergé et al. 2008, Kilbinger et al. 2008, Tereno et al. 2008).

To date, only "photometric redshift" techniques can provide (with a comparatively modest expenditure of telescope time) redshifts of enormous numbers of galaxies with sufficient precision ($\sim 1\%-5\%$) to the faintest limiting magnitudes of the CFHTLS cosmological surveys. The construction of well defined, accurate and reliable photometric redshift catalogues is therefore an indispensable task following photometric catalogue production.

Several photometric redshift codes are now publicly available and have been applied with reasonable success to many photometric catalogues of galaxies (see Hildebrandt et al. (2008), and references therein). Some recent photometric redshift studies, like the COMBO-17 survey (Wolf et al. 2003), CFHTLS (Ilbert et al. 2006, hereafter I06), SWIRE (Rowan-Robinson et al. 2008), or COSMOS (Mobasher et al. 2007, Ilbert et al. 2008), contain up to 1,000,000 galaxies as faint as $i \sim 25$. In particular, the “Le Phare” photometric redshift code (Arnouts et al. 1999, Arnouts et al. 2002, 106) has shown to be well adapted for joint photometric and spectroscopic surveys like the CFHTLS. I06 used Le Phare with the CFHTLS-Deep photometric catalogues and VVDS spectroscopic redshifts (Le Fèvre et al. 2005) to calculate photometric redshifts with an accuracy of $\sim 3\%$ at $i < 24$. The redshift distribution of sources has been used to calibrate the absolute gravitational shear signal presented in Fu et al. 2008.

By combining photometric and spectroscopic measurements they were able to derive a set of optimised Spectral Energy Distributions (SEDs). By computing the mean difference between magnitudes in each filter of objects with known redshifts...
and those derived from these optimised SEDs one can “tune” the
CFHTLS photometry. This method improves photometric red-
shifts for all galaxies, even those for which there are no spec-
troscopic measurements.
More spectra and deeper data can lead to a better calibration.
With the advent of new CFHTLS photometric data and much
larger spectroscopic catalogues we can now extend the applica-
tion of Le Phare to more complex surveys composed of many
MegaCam fields like the CFHTLS-Wide.
Most photometric redshift studies either explore shallow
very wide fields covering thousand of deg$^2$ (see [Ball et al. 2008]
for the SDSS and references therein) where visible photometric
data are sufficient to sample the whole redshift range of galax-
ies, or those which focus on deep beams of few deg$^2$ (like the
CFHTLS Deep or COSMOS) comprising both visible and near
infrared photometric data. To date, the only moderately deep vis-
ible survey currently available for photometric redshift studies
covering a large area is the CFHTLS Wide.

The aim of this work is the calibration and production of
a flux limited photometric redshift catalogues based on the
CFHTLS Deep and Wide surveys. When completed, the
CFHTLS Wide will cover 170 deg$^2$ in five optical filters spread
over four separate regions of the sky which also contain subsets
of several deep spectroscopic surveys. Ultimately, a catalogue of
more than ten million galaxies down to $i'_{AB} = 24.5$, with reliable
five-band photometry will be available for photometric redshift
measurement. In this paper, we use Le Phare to compute photo-
metric redshift for the “T0004” CFHTLS release. In addition to
the four CFHTLS Deep fields that were already analysed in pre-
vious works, T0004 includes a new large Wide catalogue, cov-
ering 35 deg$^2$ in five bands $u', g', r', i', z'$ in three independent
fields.

To construct our photometric redshift catalogues we follow
the method described in I06, but with some important changes.
To calibrate the photometric redshifts new spectroscopic data
are added to the VVDS “deep” sample (Le Fèvre et al. 2005b).
It includes the DEEP2 redshift survey (Davis et al. 2003 and
Davis et al. 2007), the new VVDS “wide” sample (Garilli et al.
2008) and the “zCOSMOS” sample (Lilly et al. 2004). We first
compute the new Deep field photometric redshift are then com-
puted first and compared to the previous I06 Deep study. Once
validated, we extend the analysis further to Wide data. We then
challenge the photometric redshift catalogues against the new
spectroscopic redshift samples to assess the robustness of the
calibration, to derive a detailed error budget for each photometric
redshift and to estimate the sensitivity of the method to param-
eters like redshift or magnitude. Finally, we derive the redshift
distribution and its field-to-field variance (cosmic variance).

The paper is organised as follows. In Section 2.1 we describe
the data used in this analysis. We show how the “T0004” pho-
tometry is used and we explain how the spectroscopic redshifts
are evaluated in the VVDS Fo2 and F22 fields and the DEEP2
survey. The next Section describes the principles of Le Phare,
and discusses recent improvements for the photometric redshift
 calibration using new spectroscopic redshift samples. Sections 2.2
and 5 focus on the photometric redshifts of the Deep and Wide
CFHTLS sample. We then discuss the photometric redshift accu-
curacy and their robustness and reliability. The redshift distribu-
tion and its variance are discussed in the last section.

Throughout the paper, we use a flat lambda cosmology
($\Omega_m = 0.3$, $\Omega_l = 0.7$) and we define $h = H_0/100$, with
$H_0 = 70$ km s$^{-1}$ Mpc$^{-1}$. Magnitudes are given in the AB sys-
tem. Photometric and spectroscopic redshifts are denoted by $z_p$
and $z_s$, respectively, and $\Delta z$ represents $z_p - z_s$.

2. Data
2.1. Photometric data
2.1.1. The CFHTLS

The CFHTLS, a joint Canadian and French survey, is composed of
three imaging surveys of different depths, shape and sky cov-
verage: the CFHTLS Deep, the CFHTLS Wide and the CFHTLS
Very Wide. The survey started in 2003 and will last for 450
nights until finishing in January 2009. When completed, the
CFHTLS Deep will cover 4x1 deg$^2$ at a limiting magnitude
of $i'_{AB} = 27.5$ (point source, S/N=5, 1.15” aperture, seeing 0.8’’)
and the Wide will cover 170 deg$^2$ over 4 fields with a limiting
magnitude of $i'_{AB} = 25.5$.

The CFHTLS is conducted at the 3.6m Canada-France-
Hawaii Telescope, equipped with the new MegaPrime prime-
focus assembly and the MegaCam wide field camera
(Boulade et al. 2000). MegaCam is composed of 36 2080x4644
pixel EEV CCDs. MegaCam has a pixel scale of 0.186’’/pixel and
therefore covers the entire 0.96x0.98 deg$^2$ unvignetted
MegaPrime focal plane. The CCD assembly leaves small gaps
between each detector and two blind lanes of 62’’ width along
the X-axis (E-W direction). For this reason each field is observed
in a dithering pattern to fill the gaps between the CCDs and help
in removing systematic CCD features.

MegaPrime is equipped of $u', g', r', i', z'$ broad band filters
that provide continuous coverage over the whole spectral range
3500Å < $\lambda$ < 9400Å. Only the CFHTLS Deep and Wide sur-
veys which are observed in the five MegaCam $u', g', r', i', z'$
broad band filters are suitable for photometric redshift compu-
tation.

The positions of the four deep fields and the three wide fields
used in this work are listed in table 1. Each Wide field has a dif-
ferent geometry and sky coverage: W1 (8°x9° “tiles” of 1°x1°
each), W3 (7°x7°), W4 (a 7°x 3.5° strip along the South-
East/North-West direction), and is composed of a contiguous mosa-
ic of MegaCam fields. The identification name and position
of all fields can be found on the Terapix web page.

W1 and W3 overlap with D1 and D3, respectively, while W4
located a few degrees apart D4. Each MegaCam “tile” (which is an elementary 1°x1° MegaCam area paving the sky) com-
posing a Wide field overlaps with its four neighbouring fields.
The width of overlap regions is around 2° in both directions. The
overlap between pointings can be used for the astrometric and
photometric calibrations.

2.1.2. The T0004 release

The data used in this work are part of the CFHTLS T0004 release
produced at the Terapix data center. The release consists of all
CFHTLS Deep and Wide images observed from June 1st, 2003
to October 24th, 2006.

For the photometric redshift study, we consider only fields
with observations in all five photometric bands. Our parent sam-
ple is therefore reduced to $u', g', r', i', z'$ images, namely
- the 4x1 deg$^2$ Deep fields with longer integration times than
the previous T0003 release (~ 0.2mag deeper) used in I06, and
- the 35 deg$^2$ of the Wide field that are completed in all filters
and distributed as follows: 19 deg$^2$ in W1, 5 deg$^2$ in W3 and
11 deg$^2$ in W4.

\footnote{http://terapix.iap.fr/cplt/oldSite/
Descart/summarycfhtlswide.html}
The sky coverage of the complete parent data set is shown in figure 1.

For each deep field, Terapix produces two stacks per filter. One comprises the 25% best seeing images and the other consists of the 85% best seeing images. Since both types of deep stack have seeing better than one arc-second and we are primarily interested in very deep galaxy catalogues, we used the deepest 85% to compute the photometric redshifts.

Table 1 summarises the data used for this study and also in Ilbert et al. (2006).

2.1.3. Production of T0004 catalogues

Full details of the processing and content of the T0004 release are described in the Terapix page. Further details on calibration and stack and catalogue production can also be found also in McCracken et al. (2008) and in the Mellier et al. (2005) explanatory document. In what follows we summarise briefly how the input catalogues used for the photometric redshifts have been produced.

Fig. 1. Sky coverage of the CFHTLS Deep fields (D1, D2, D3, D4) and Wide fields (W1, W3 and W4) overlapped with spectroscopic surveys: VVDS F02, F22 and DEEP2.
Table 1. Summary of the data used in this study and in I06.

| Field       | Center Position | Area (unmasked) | 80% completeness limit (\(t_{16}\)) | Spectroscopic data |
|-------------|-----------------|-----------------|-------------------------------------|--------------------|
| Deep - D1   | 02°25′59″, −04°29′40″ | 0.77 deg²       | 25.1                                | VVDS Deep          |
| Deep - D2   | 10°00′28″, +02°12′30″ | 0.69 deg²       | 24.9                                | no                 |
| Deep - D3   | 14°19′27″, +52°40′56″ | 0.83 deg²       | 25.7                                | no                 |
| Deep - D4   | 22°15′31″, −17°43′56″ | 0.82 deg²       | 25.3                                | no                 |

This study. CFHTLS release T0004.

| Field       | Center Position | Area (unmasked) | 80% completeness limit (\(t_{16}\)) | Spectroscopic data |
|-------------|-----------------|-----------------|-------------------------------------|--------------------|
| Deep - D1   | 02°25′59″, −04°29′40″ | 0.78 deg²       | 25.3                                | VVDS Deep          |
| Deep - D2   | 10°00′28″, +02°12′30″ | 0.80 deg²       | 25.1                                | zCOSMOS            |
| Deep - D3   | 14°19′27″, +52°40′56″ | 0.83 deg²       | 25.9                                | DEEP2              |
| Deep - D4   | 22°15′31″, −17°43′56″ | 0.82 deg²       | 25.5                                | no                 |
| Wide - W1   | 02°18′00″, −07°00′00″ | 19.1573 deg²    | > 24.3                              | VVDS Deep          |
| Wide - W3   | 14°17′54″, +54°30′31″ | 5.05 deg²       | > 24.4                              | DEEP2              |
| Wide - W4   | 22°13′18″, +01°19′00″ | 11.87 deg²      | > 24.4                              | VVDS F22           |

Pre-processing of raw images (masking bad pixels, removing the overscan, subtracting the dark and the bias, flat fielding and illumination correction) is performed by the Elixir pipeline at CFHT (Magnier & Cuillandre 2004). The data are then transferred to Terapix to produce the stacked images and the final catalogues. Figure 2 shows the flowchart of the T0004 release production. Each image is first examined by the Terapix QualityFITS image quality control tool. During the QualityFITS step (hereafter QFITS-in) a set of quality assessments is produced, all individual input images are inspected and evaluated and a weightmap image as well as an input catalogue are produced. This catalogue will be used later for the photometric calibration. It is produced using SExtractor (Bertin & Arnouts 1996) with appropriate settings for saturation levels to eliminate any spurious objects which could lead to an incorrect computation of the flux re-scaling during the astrometric matching process. A QFITS-in web page summarises the inspection and is used as an ID-card of each image. All QFITS-ed images are then graded “A”, “B” or “C”, after a visual inspection of each web-page.

With the QFITS-in information available, Terapix selected the T0004 image sample by applying the following criteria:

- Terapix class: A or B grades (all images within the CFHTLS specifications; grade B images that may show minor problems or with specifications very close to limits),
- Exposure time higher than 60 s.,
- Seeing less than 1.3″, except for u+ (less than 1.4″),
- Airmass less than 1.7,
- Skyprobe value lower than 2.0 magnitudes (security limit)

Rejected images will no longer be considered. Terapix then uses the QFITS-in catalogues of the remaining images to derive the astrometric and photometric calibrations for the release.

The astrometric solution is computed using SCAMP (Bertin 2006). SCAMP first examines all image headers and then split the exposures into a series of astrometric contexts. Each context separates blocks of observing epochs where the instrument focal plane is in a fixed and (almost) stable configuration. The detections and positions of astrometric sources on MegaCam images are derived by the cross-identification of sources of the QFITS-in catalogue with the 2MASS astrometric reference catalogue. For the T0004 release, the source matching exploration radius is set to 2″ for all Deep and Wide fields. A polynomial distortion model is then derived by minimising a weighted quadratic sum of differences in positions between the 2MASS and the QFITS-in matched sources, and, internally, between different QFITS-in catalogues with overlap regions. Using this information SCAMP can then compute external and internal errors.

For the Wide data, the astrometric solution is performed only once for each Wide field by using all image catalogues simultaneously, regardless the filter and the epoch. All images of a given Wide field are then calibrated globally and in a homogeneous way. For the 85% Deep data, the solution must be computed differently. The number of observing runs produces too many astrometric contexts which results in a matrix that cannot be inverted with the current Terapix computing resources. The Deep field images are then divided into five sub-samples, one for each filter. In order to improve the consistency and the robustness of the solutions found for each filter, a common set of extra images surrounding the field and shifted by about 30′ with respect to Deep centre positions is added to each sub-sample. The consistency of each solution has been checked afterwards.

In both cases, the Deep and the Wide calibrations worked well. For T0004, the rms internal error of Wide and Deep astrometric solution is 0.017″ and the mean rms external error is 0.21″ in both directions. After inspection, if acceptable, the astrometric solution is then written in the .head file attached to each image.

SCAMP is also used to derive a relative photometric calibration by minimizing a weighted, quadratic sum of magnitude differences on the overlap regions between images. Images flagged as “photometric” by CFHT are used as anchor points and their CFHT magnitude zero point is written in the .head file. For the photometric calibration, SCAMP minimizes the quadratic sum of magnitudes using the overlap region between images. The flux of non-photometric images are then re-scaled accordingly. Typical re-scaling amplitudes in T0004 are ±0.02 magnitude. However, for some highly non-photometric images it may reach ±0.50 magnitudes. For these extreme outliers, the re-scaling itself becomes more and more unreliable and the observed error on the rescaling value can be significantly higher than the typical ±0.02 value. For this reason all images with rescaling greater than 0.15 magnitudes were removed from the input list.

After this post-SCAMP selection process images are divided into filter and tile positions and images are then resampled and
T0004: Terapix data flow and data products

Fig. 2. Details of the data processing performed by Terapix.

co-added with SWarp\(^5\) (Bertin et al. 2002). An ASCII polygon mask is produced at each tile position which can be visualised using the “DS9” image display software. Each Wide stack is only composed of images centred at the tile position and the overlapping pixels of nearest neighbour tiles are not used. For each stack a 1 deg\(\times\)1’ strip masks the boundaries of fields in order to drop regions with highly elongated PSF and low signal-to-noise.

T0004 stacks are produced by a median filter and a Lanczos-3 interpolation kernel. All stacks have 19354 \(\times\) 19354 pixels of 0.186” (i.e. exactly 1\(\times\)1 deg\(^2\)) and have a magnitude zero point set to 30. For the Wide survey, a stack is produced at each centre position listed in the Terapix web page\(^6\). A SExtractor catalogue is then produced for each stack that is used to run QualityFITS and produce a QFITS-out “ID-card” of each stack. QFITS-out as well as all quality control data of all stacks are publicly available at http://terapix.iap.fr/article.php?id_article=724. They have been used to carry out visual inspections and the validation of the T0004 release.

If \(g'\), \(r'\) and \(i'\) band data are available, Terapix automatically produces a “chi2 image” based on these three stacks (Szalay et al. 1999). Then SExtractor is run in dual-image mode on both the chi2 image and each stacked image \((r', g', i', \text{as well as } u' \text{ and } z', \text{if any})\). All catalogues contain parameter values for all quantities listed in http://terapix.iap.fr/article.php?id_article=628. In this study, we use the merged \((u, g', r', i', z', \text{if any})\) catalogues produced by Terapix that include a limited number of parameters (only MAG\(\text{AUTO}\) magnitudes, for example) plus the \(E(B-V)\) value at each source position derived from dust map images (Schlegel et al. 1998).

After removing the masked areas, the effective field-of-view is 0.78, 0.80, 0.83 and 0.82 deg\(^2\) for the D1, D2, D3 and D4, respectively and 15.73, 4.05 and 8.87 for the W1, W3 and W4, respectively. Effective areas for each individual tile in the Wide fields are given in the

\(^5\) http://terapix.iap.fr/soft/swarp
\(^6\) http://terapix.iap.fr/cplt/oldSite/Descart/summarycfhtlswide.html
http://terapix.iap.fr/cplt/table_syn_T0004.html

All catalogues include flux with uncertainties. However, in this work we follow I06 and we scaled the SExtractor flux error estimates by a factor of 1.5 to compensate for the slight noise correlation introduced by the image re-sampling during image stacking.

Finally, a series of post-processing analysis is then carried out in order to make quality assessments for each stack and, globally, for the whole release. The QFITs-in, SCAMP, QFITs-out output files are part of the quality assessment data. More specific control files are also created using the merged (\(u^*, g^*, r^*, i^*, z^*\)) catalogues, like stellar colour-colour plots and comparisons between the T0004 stellar photometry and the Sloan Digital Sky Survey (SDSS)\(^7\). This quality control data are available at http://terapix.iap.fr/cplt/table_syn_T0004.html.

The comparison between CFHTLS T0004 and SDSS photometry is made using stars in common in the magnitude range 17 < \(AB\) < 21.1. The results are displayed at http://terapix.iap.fr/article.php?id_article=713. The mean offset between CFHTLS and SDSS, \(\Delta_{\text{CFHTLS-SDSS}}\), varies from stack to stack in the range \(-0.03 < \Delta_{\text{CFHTLS-SDSS}} < 0.03\) magnitude. A calibration problem was noticed on \(u^*\)-band images obtained during the period from March 2006 until October 24th, 2006 showing a mean offset of 0.21 mag. with respect to SDSS. Following the Terapix table all \(u^*\)-band values obtained during this period were corrected for the offset derived from the SDSS. In the few CFHTLS fields with no overlap with SDSS, we applied a correction of 0.2 mag.

2.1.4. Field-to-field photometric stability

The Terapix pipeline uses common sources in overlap regions between each contiguous MegaCam field to derive a photometric magnitude zero-point correction after a field-to-field flux rescaling. It is computed by SCAMP to produce a Wide survey as uniform as possible over all W1, W2, W3 and W4 fields. The recipe relies on the CFHT magnitude zero points and photometric flags written in the FITS header and in the observing logs, respectively. It is possible that some series of marginally photometric images produce a poor flux rescaling solution. We minimised this risk by removing photometric outlier images from the T0004 sample during the post-SCAMP selection process (See Section 2.1.3). However, some fields may still show residuals, in particular at the borders of the survey where the field-to-field rescaling cannot be done using the four MegaCam boundaries of each stack. The comparison between CFHTLS and SDSS photometry confirms the uniformity is good to within ±0.03 mag. over the whole fields, but there are a few fields that are off by as much as ~0.10 mag.

This problem can be partially overcome by Le Phare. The code uses spectroscopic redshifts to correct the magnitude offsets (hereafter systematic offsets) in the CFHTLS wide fields that overlap with spectroscopic fields. The estimate of the field-to-field magnitude variations and how it can affect the photometric redshift accuracy is discussed in a forthcoming section.

2.2. Spectroscopic data

We used spectroscopic redshifts (spectro-z’s) from the VVDS survey for the D1 and W1 fields. The VVDS data were obtained with the Visible Multi-Object Spectrograph (VIMOS)\(^8\) installed at the ESO-VLT. The deep spectroscopic sample VVDS-0226-04 was selected in the magnitude range 17.5 < \(I_{\text{AB}}\) < 24.0 and has a median redshift of \(\sim 0.67\) (Le Fèvre et al. 2005a). Keeping only sources with a confidence level in the redshift measurement greater than 97% (class 3 and 4), our parent VVDS-0226-04 spectroscopic sample is composed of 3880 galaxies. We matched 3276 galaxies in the D1 field and 3356 galaxies in the W1 field with \(I_{\text{AB}}\) ≤ 24.

We also used the public spectroscopic redshifts from the zCOSMOS survey (Lilly et al. 2007) which overlaps with the D2 field. The zCOSMOS-bright spectra were obtained with the VIMOS spectrograph and were selected at \(I_{\text{AB}}\) ≤ 22.5. 3915 spectro-z’s with a confidence level greater than 99% are usable for the D2 field.

In addition, our spectroscopic calibration sample includes 5936 spectro-z’s from the third data release of the DEEP2 survey (Davis et al. 2003 and Davis et al. 2007). This sample overlaps with the D3 field and covers a small area in the W3 field (see Fig. D). Spectra were obtained by the spectrograph DEIMOS\(^9\) mounted on the Keck II telescope. As for the VVDS sample we used the most secure spectro-z’s, with quality flag 3 or 4, corresponding to confidence level greater than 95%. The DEEP2 data taken in the Extended Groth Strip region have been preselected in the range 18.5 < \(R_{\text{AB}}\) ≤ 24.1, with a selection based on color and surface brightness only aimed at maximizing the number of galaxies over the number of stars (in contrast with the rest of the DEEP2 survey where selection criteria to target only higher-redshift galaxies are used). A smaller subsample of 310 spectro-z’s are in the W3 field.

Finally, the VVDS-Wide survey (VVDS-F22 field, Garilli et al. 2008) overlaps with the W4 field. The VVDS-Wide covers a 4 deg² contiguous area in the W4 field. The spectro-z catalogue includes 11 228 galaxies, 167 type I AGNs, and 6 748 stars. Using the most secure spectro-z (confidence level greater than 97%, class 3 or 4) our final sample comprises 3 854 galaxies in the magnitude range 17.5 < \(I_{\text{AB}}\) ≤ 22.5.

D4 is the only field without any spectroscopic coverage.

3. Photometric redshifts for the CFHTLS-T0004 catalogue

3.1. Photometric redshift computation with Le Phare

Photometric redshifts were computed using a standard \(\chi^2\) template-fitting procedure and calibrated using spectroscopic redshifts. We used the code Le Phare\(^10\) described in Arnouts et al. (1999) and Arnouts et al. (2002) with the addition of the optimisation procedure presented in I06.

We first selected a set of reference SED templates. These were the same CFHTLS-optimised templates as I06 used.

The original set of templates is composed of four observed galaxy spectra from Coleman et al. (1980) (hereafter CWW) and two starburst galaxy spectra from Kinney et al. (1996). The ultraviolet (\(\lambda < 2000\)Å) parts of the spectra have been linearly extrapolated and the near infrared parts are extrapolated using the synthetic models proposed by Bruzual & Charlot (2003). It is clear that the large variety of galaxy spectra observed in the

http://loen.ucolick.org//Deimos/deimos.html
http://www.eso.org/sci/facilities/paranal/instruments/vimos/overview.html
http://www.oamp.fr/people/arnouts/LE_PHARE.html
The Universe cannot be represented by only a small number of optimised templates. However, adding too many templates creates degeneracies between observed colors and redshifts. For this reason we use only a small number of spectral types.

The six templates were "optimised" for the CFHTLS using 2867 spectroscopic redshifts from the VVDS deep survey. The optimisation procedure, described in I06, consists of "blue-shifting" the observed photometric data to rest-frame using the VVDS spectroscopic redshifts. A low resolution optimised version of the template is obtained by averaging the rest-frame fluxes of all the galaxies (as shown in Fig.5 of I06). Finally, the templates were linearly interpolated between spectral types in order to cover the full redshift-color space. In total, 62 optimised templates are generated.

Each SED template was then redshifted onto a grid of intervals $\delta z = 0.04$ and convolved with the filter transmission curves (including instrument efficiency). The photometric redshifts were derived by determining which SED template provides the best match to the observed colours (minimisation of the $\chi^2$ merit function). The galaxy internal reddening, $E(B - V)$, was included as a free parameter in the template-fitting procedure. The values allowed for $E(B - V)$ were derived from the Small Magellanic Cloud extinction law (Prevot et al. 1984), varying from 0.2 to 0.2 for Scd and later types, and no reddening was allowed for earlier types.

Since no near infrared data were available to break the colour-redshift degeneracies between $z < 0.5$ and $z > 2.5$ (in general caused by an inability to distinguish between the Balmer and Lyman breaks), a "prior" on the redshift distribution has been applied following the Bayesian approach described in Benítez (2000). We used the parameterised redshift distribution estimated from the VVDS deep spectroscopic survey. In I06, the redshift distribution was estimated by spectral type and as a function of apparent magnitude. On the basis of the luminosity functions measured by Ilbert et al. (2005) we reject unrealistic objects with $M_g < -24$.

A redshift Probability Distribution Function (PDF$_z$) is computed for each object using the $\chi^2$ merit function, $PDF_z \propto \exp(-\chi^2(z)/2)$. The PDF$_z$ is measured every $\delta z = 0.04$. The best redshift is estimated via a parabolic interpolation of the PDF. If a second peak is found in the PDF with a height larger than 5% of the main peak, the corresponding redshift is given as a second solution.

In addition to the best $\chi^2$ derived from the galaxy library (hereafter $\chi^2_{gal}$), a best $\chi^2$ computed using the stellar library of Pickles (1998) is derived for each object (hereafter $\chi^2_{star}$). Both $\chi^2$'s are used to compute the star-galaxy classification as will be explained in a later Section.

### 3.2. Correction of systematic offsets

As demonstrated by Brodwin et al. (2006), I06 and Ilbert et al. (2008), systematic offsets are often found between the best-fit SED templates and the observed apparent magnitudes in a given filter. Uncertainties in the zero-point calibration of the photometric data as well as imperfect knowledge of galaxy SEDs or of filter transmission curves are responsible for these offsets. They may produce additional biases in the photometric redshift measurements and must be corrected.

In this work, we recomputed these offsets to account for the changes in our spectroscopic and photometric catalogues with respect to those used in I06. These changes are:

- The T0004 catalogues have been regenerated after a complete re-processing of all data;
- The CFHTLS Wide data were not used by I06. These new stacks cover 35 deg$^2$ and combine many MegaCam tiles;
- New spectroscopic samples are now available for many CFHTLS fields (which were not available in I06). It is now possible to compute offsets for many new fields and to derive field-to-field systematic offsets.

Following the procedure used in I06, we minimised the SED template $\chi^2$'s at a fixed spectroscopic redshift with an additional free offset per band that account for the systematics. The offsets are then derived iteratively. For all spectroscopic surveys, the calibration was performed using the most secure spectroscopic redshifts. Stars were not used for the offset computation.

In this study we limited the spectroscopic samples to $i'_{AB} \leq 22.5$. As shown by I06 this correction depends only weakly on the spectroscopic limiting magnitude. Each offset correction was derived and applied independently for each field covered with spectroscopic data (see section 2.2). Table 2 shows the systematic offsets derived for the Deep and Wide fields in each band. The systematic offsets vary from -0.041 ($g'$) to 0.077 ($u'$) magnitudes and show a small dispersion between the fields, on the order of 0.01 mag. For this reason we added 0.01 magnitudes in quadrature to the error estimate to account for the systematic offset uncertainties.

D4 is the only field which does not overlap with any spectroscopic survey. For this field, we used a mean offset correction, computed using a combined catalogue of D1/VVDS deep, D2/zCOSMOS and D3/DEEP2.

#### 3.3. Photometric/spectroscopic comparison for the T0004 Deep fields

We evaluate in the two following sections the photometric redshift accuracy by comparing photometric redshifts against spectro-z's. We first consider the Deep fields; in the following Section we consider the Wide fields.

As in I06, we define two relevant quantities:

- the photometric redshift dispersion, $\sigma_{\Delta z}/(1+z_s)$. It is defined using the normalised median absolute deviation $\sigma_{\Delta z/(1+z_s)} = 1.48 \times$ median($|\Delta z|/(1+z_s)$), a robust approximate of the standard deviation,
- and the outlier rate, $\eta$, also called catastrophic errors, defined as the proportion of objects with $|\Delta z| \geq 0.15 \times (1+z_s)$.

where $z_p$ is the photometric redshift, $z_s$ the spectroscopic redshift, and $\Delta z = z_p - z_s$.

For the VVDS Deep and DEEP2 surveys we can make comparisons to $i'_{AB} < 24$. In the D2 field, for the brighter zCOSMOS survey comparisons cannot be made fainter than $i'_{AB} = 22.5$. Figure 3 shows the comparison between photometric and VVDS spectroscopic redshifts for the D1 field; zCOSMOS for the D2 field and DEEP2 for the D3 field. The dispersion ($\sigma_{\Delta z/(1+z_s)}$) for D1 and D3 in the range $17.5 < i'_{AB} < 24$ is 0.028 and 0.030 respectively, and the dispersion for D2 in the range $17.5 < i'_{AB} < 22.5$ is 0.026. The outlier rate ($\eta$) is 3.57% in D1, 3.62% in D3 and 1.35% in D2. These results demonstrate that the photometric redshift accuracy is comparable for the three deep fields. Slightly better results are found in D2 as this sample has a brighter limiting magnitude. We checked this assumption by cutting the limiting magnitudes for the D1 and D3 at $17.5 < i'_{AB} < 22.5$. We found the same dispersion for the three fields, $\sigma_{\Delta z/(1+z_s)} = 0.026,$
Table 2. Systematic offsets of $i'_{AB} < 22.5$ limited samples for the Deep and Wide fields.

| Band   | D1/VVDS | D2/zCOSMOS | D3/DEEP2 | W1/VVDS | W3/DEEP2 | W4/VVDS f22 | mean  | dispersion |
|--------|---------|------------|----------|---------|----------|-------------|-------|------------|
| $g'$   | 0.0068  | 0.0765     | 0.045    | 0.055   | 0.064    | 0.071       | 0.065 | 0.013      |
| $g' - i'$ | -0.055 | -0.047     | -0.038   | -0.035  | -0.030   | -0.040      | -0.041 | 0.009      |
| $r' - i'$ | 0.016   | 0.025      | 0.021    | 0.003   | 0.040    | 0.032       | 0.022 | 0.015      |
| $i' - z'$ | 0.003   | -0.001     | 0.001    | 0.022   | 0.008    | 0.001       | 0.006 | 0.009      |
| $z' - r'$ | 0.001   | -0.009     | -0.004   | -0.022  | -0.037   | -0.010      | -0.014 | 0.014      |

Fig. 3. Photometric redshift accuracy in the Deep survey. We compare photometric redshifts with spectro-z’s for D1 with VVDS deep (left), for D2 with zCOSMOS (middle) and for D3 against DEEP2 (right). The brighter zCOSMOS survey is limited to $i'_{AB} = 22.5$. In each panel we show the dispersion, $\sigma_{\Delta z/(1+z_s)} = 1.48 \times \text{median}(\Delta z/(1+z_s))$, and the outlier rate, $\eta$, the proportion of objects with $|\Delta z| \geq 0.15 \times (1+z_s)$. In the top panel, triangles represent objects for which we found a second solution in the PDF. In the bottom panel, the object density in the zphot-zspec plane is plotted.

as well as slightly different but better outlier rates for the three fields: 1.68 for D1, 1.35 for D2 and 2.36 for D3.

The consistent results found for these three deep fields are reassuring. Although our templates have been optimised using one single field (D1) with one set of spectra (VVDS Deep), they can be used with confidence on other deep fields without degrading the photometric redshift accuracy or increasing the fraction of outliers.
3.4. Photometric/spectroscopic comparison for the T0004 Wide fields

The photometric redshift accuracy is function of the signal-to-noise ratio (hereafter \( S/N \)) of the photometric data (e.g. Marstoniner and Wittman 2007). Since the Wide survey is much shallower than the Deep survey the median \( S/N \) is lower at a given magnitude in the Wide than in the Deep (see Figure 4 for the D1 and W1 fields). Therefore, we expect less accurate photometric redshifts for the wide in comparison with the deep fields at the same magnitude.

First, we measured the photometric redshift accuracy as a function of decreasing \( S/N \) (i.e. increasing magnitude) in the wide fields.

Noise is estimated using magnitude errors from SExtractor’s MAG_AUTO, \( \Delta m \), rescaled by a factor 1.5 (See Section 2.1.3). Using the VVDS deep spectroscopic sample, we measured the photometric redshift precision to \( i'_{AB} = 24 \). In Table 2 we show the dispersion and the outlier rate for the W1 field as a function of limiting magnitude. We found that \( \sigma_{\Delta z/(1+z_s)} \) is larger at fainter magnitudes. At \( i'_{AB} < 24 \) the dispersion is 0.053. However the number of outliers increases dramatically beyond \( i'_{AB} = 23 \), reaching 10% at \( i'_{AB} < 24 \). We conclude that photometric redshifts are reliable down to \( i'_{AB} = 22.5 \) in the Wide field (with a median \( S/N = 33 \)). Fainter than \( i'_{AB} = 23 \) the number of outliers becomes important.

Next we compared the photometric redshift accuracy between the different Wide fields. We limited the comparison to \( i'_{AB} < 22.5 \) (median \( S/N = 33 \)) which is the limiting magnitude of the zCOSMOS and VVDS-Wide spectroscopic surveys. Figure 5 shows the comparison between photometric and spectroscopic redshifts (W1 against VVDS deep, W3 against DEEP2 and W4 against VVDS Wide). The dispersion \( \sigma_{\Delta z/(1+z_s)} \) is found to be identical for all fields, ranging from 0.036 to 0.039 (0.037 for W1, 0.036 for W3 and 0.039 for W4). The outlier rate, \( \eta \), is 2.81%, 3.55% and 3.79% for W1, W3 and W4, respectively. As for the Deep survey, these results show that one can successfully use templates optimised in an independent field to reach comparable accuracy.

We also noticed that despite being calibrated with a small spectroscopic sample, the photometric redshift accuracy and outlier rate in the D3 field are comparable to the other fields. For the purpose of photometric redshift calibration, it appears that for the same amount of time dedicated to a spectroscopic survey it is more important to cover a larger area with bright spectroscopic redshifts (which can correct for inhomogeneities in the photometric calibration) rather than a smaller.

Finally, in order to perform a fair comparison between the Deep and Wide photometric redshift one must consider samples with equal \( S/N \). Therefore, in order to match the median \( S/N = 43 \) corresponding to \( i'_{AB} < 24 \) in the Deep, we limit the magnitude to \( i'_{AB} = 22 \) in the Wide (from figure 4) and measure a dispersion of 0.032, similar to the value of 0.028 found for the D1 photometric redshifts.

3.5. Effects of the tile-to-tile systematic offset variation

From Figure 1 one can see that CFHTLS fields have only partial spectroscopic coverage. The offset calibration can only be performed in sub-areas where there is spectroscopic coverage, and we assume the systematic offsets measured in a sub-area of the field can be applied to the whole field.

This assumption is most valid for the CFHTLS deep fields since each spectroscopic sample fits within one tile, but more problematic for the CFHTLS wide fields which are ten times larger and are composed of many continuous tiles. As it was discussed in Section 2.1.4, the \( \Delta\sigma_{\text{CFHTLS-SDSS}} \) photometric comparison performed by TERAPIX shows the differences with SDSS have a mean scatter of \( \pm 0.03 \) magnitudes which corresponds to the photometric scatter from tile to tile. Table 2 confirms these trends in our calibrations.

Only 15 of 35 tiles in the Wide fields have spectroscopic data (not all centered in the tile). Therefore, the calibration of the systematic offsets cannot be performed tile by tile in the wide fields. Instead, they are averaged over several tiles (W1 has four overlapping tiles over 19 with VVDS deep, W3 has two overlapping tiles in five with DEEP2 and W4 has nine overlapping tiles in 11 with VVDS wide). Therefore, tile-to-tile photometric calibration variations are an additional source of error which degrades the photometric redshift accuracy in the Wide fields.

We assessed the impact on the photometric redshift accuracy of this additional source of error, assuming a tile-to-tile variation of 0.03 magnitudes (see Sect. 2.1.3). We simulated variations of

| W1 | \( i'_{AB} \) | \( S/N \) | \( \sigma_{\Delta z/(1+z_s)} \) | \( \eta \) (%) |
|----|-----------|-------|----------------|---------|
| 20.5 | 64 | 0.025 | 1.12 |
| 21.0 | 60 | 0.026 | 1.57 |
| 21.5 | 52 | 0.029 | 1.39 |
| 22.0 | 43 | 0.032 | 2.25 |
| 22.5 | 33 | 0.037 | 2.81 |
| 23.0 | 24 | 0.043 | 4.91 |
| 23.5 | 16 | 0.048 | 7.63 |
| 24.0 | 11 | 0.053 | 10.13 |

| D1 | \( i'_{AB} \) | \( S/N \) | \( \sigma_{\Delta z/(1+z_s)} \) | \( \eta \) (%) |
|----|-----------|-------|----------------|---------|
| 20.5 | 72 | 0.030 | 0.54 |
| 21.0 | 72 | 0.027 | 1.17 |
| 21.5 | 72 | 0.025 | 1.32 |
| 22.0 | 68 | 0.026 | 1.30 |
| 22.5 | 68 | 0.026 | 1.82 |
| 23.0 | 60 | 0.026 | 2.11 |
| 23.5 | 54 | 0.027 | 2.59 |
| 24.0 | 43 | 0.028 | 3.57 |

Fig. 4. Median signal-to-noise ratio with respect to the limiting magnitude in the Wide (W1) and the Deep (D1) field. The \( S/N \) is 1.0857/\( \Delta m \), taken in the \( i' \) band. The dashed line represents the median \( S/N = 33 \), corresponding to the value of the Wide sample cut at \( i'_{AB} < 22.5 \).

Table 3. Photometric redshift accuracy in the W1 and D1 fields for several limiting magnitudes.
Fig. 5. Photometric redshift accuracy in the Wide survey at $i'_{AB} < 22.5$. We compared photometric redshifts with spectro-z’s for W1 with VVDS deep (left), for W3 with DEEP2 (middle) and for W4 with VVDS Wide (right). In each panel we show the dispersion, $\sigma_{\Delta z/(1+z)} = 1.48 \times \text{median}(|\Delta z|/(1+z))$, and the outlier rate, $\eta$, the proportion of objects with $|\Delta z| \geq 0.15 \times (1+z)$. In the top panel, triangles represent objects for which we found a second solution in the PDF. Bottom: density of objects in the $z_{\text{phot}}$-$z_{\text{spec}}$ plane is plotted.

The photometric calibration on fields with spectroscopic data as follows:

1. we computed the systematic offsets from a field with spectroscopic data (with unchanged photometry);
2. we modelled the tile-to-tile zero-point variation with a Gaussian distribution with zero mean and a dispersion of 0.03. We applied offsets to this field, but on the 5 bands independently (i.e. we drew an independent value for each band);
3. we computed the photometric redshifts but we kept the offset corrections derived at the first step. Since we did not compute the systematic offsets again this sequence is equivalent to derive systematic offsets from one field and apply them on another field;
4. finally, we estimated the uncertainties (photometric redshift dispersion and outlier rate).

We repeated this procedure 1000 times and computed the mean and standard deviation for the photometric redshift dispersion $\sigma$ and for the outlier rate, $\eta$.

Figure 6 shows the results for the Deep and Wide fields. As expected, photometric redshift accuracy degrades. On average, $\sigma_{\Delta z/(1+z)}$ is 21% worse in the Deep field and 14% worse in the Wide field, whereas they were selected to have comparable $S/N$. The worse degradation observed for the Deep field is likely due to the numerous faint objects, more sensitive to photometric variations. The outlier rate shows a similar trend, with a value 13% worse in the Deep sample and 17% in the Wide sample. This analysis shows the need for spectroscopic surveys spread over large areas.
We have derived an e-galaxies at the depth of the Wide and Deep CFHTLS surveys. For example in the CFHTLS W4 field stellar sources comprise
Bright samples (\(i - i^\prime < 21\)) can be highly contaminated by stars. We fitted in
\(\Delta z = 0.037\) and \(\eta = 2.71\%\) for the D1 sample, demonstrating that the Wide and Deep photometric redshifts are well consistent with each other.

### 4. Size selection

A widespread technique to separate stars from galaxies involves comparing the size of sources with the local shape of the PSF. Bright objects comparable in size to the local PSF are identified as stars while those with larger size are selected as galaxies. Figure 8 illustrates the difference in size between galaxies and stars for two tiles of the W1 and W4 fields. The size of the sources is characterised by the half-light radius, \(r_h\), which is defined as the radius which encloses 50% of the object flux. The lower panels of figure 8 show the size (\(r_h\))-magnitude (\(i^\prime\)) diagram (Fahlman et al. 1994), Due to statistical measurement errors of \(r_h\) and to the large PSF variation over the MegaCam field of view the dispersion of the \(r_h\) distribution is broad.

Spectroscopic redshifts can be used to securely distinguish stars and galaxies and to clearly define star-galaxy selection criteria calibrated on bright sources. We define a “true” star as an object with \(z_s = 0\) and a “true” galaxy an object with a secure spectroscopic redshift \(z_s > 0\). Figure 8 shows the positions of spectrscopically confirmed stars (asterisks) and spectroscopically confirmed galaxies (black squares) in the \(r_h\) vs \(i^\prime\) diagram for two tiles in the wide fields. At bright magnitudes, a stringent cut in \(r_h\) can reliably separate stars from galaxies. We then set this cut on each CFHTLS Deep field and Wide tile independently: at \(i^\prime < 21\) the \(r_h\) distribution is predominantly composed of stars.
The histogram of $r_h$ values is close to a normal distribution, slightly skewed towards larger $r_h$ by the galaxies (top panel of Figure 8). For this reason we fit the $r_h$ distributions at $i'_{AB} < 21$ of all Deep and Wide tiles independently by a Gaussian. We denote $\mu_{r_h}$ and $\sigma_{r_h}$ the best fit mean and standard deviation values respectively. In the Gaussian approximation of the $r_h$ distribution, almost all stars should lie in the range $0 < r_h < \mu_{r_h} + 3\sigma_{r_h} = h_{limit}$.

### 4.2. Colour selection

A purely size-based selection as described in the previous section limits reliable star-galaxy classification to only the brightest sources. As shown in Figure 8 the proportion of spectroscopically identified galaxies fainter than $i'_{AB} = 21$ which satisfies the size criterion $r_h \leq h_{limit}$ increases towards fainter magnitudes, where galaxy and star populations become increasingly mixed. Adding an additional colour-based selection can improve the star-galaxy separation at fainter limits.

Following the galaxy spectral type classification based on the galaxy template fitting criteria (namely, $\chi^2_{\text{galaxy}}$), we also characterise each source by its stellar spectral type, based on a fitting of stellar templates (namely, $\chi^2_{\text{star}}$). We used a set of templates from Pickles (1998) to estimate $\chi^2_{\text{star}}$.

Ideally, a galaxy would satisfy the relation $\chi^2_{\text{gal}} < \chi^2_{\text{star}}$. However, $\chi^2_{\text{gal}}$ and $\chi^2_{\text{star}}$ were derived from independent SED libraries and with a different number of parameters. The relevance and the statistical significance of the comparison between $\chi^2_{\text{gal}}$ and $\chi^2_{\text{star}}$ have been assessed by using the spectroscopic sample. We used a free parameter to account for the differences between each $\chi^2$ estimate and found that the criterion $\chi^2_{\text{gal}} < \chi^2_{\text{star}} \times 2/3$ is robust and can be applied to all sources up to $i'_{AB} = 23$.

When only optical data ($u', g', r', i', z'$) are used, stellar and galaxy colors overlap (shown in figure 9 is the $\chi^2$ distributions for stars and galaxies in the spectroscopic sample). As in the case of a purely size-based selection, a selection based solely on a multi-colour criterion cannot be used in isolation. The most robust star-galaxy separation consists in using both the $\chi^2$ selection and the size criterion. Each source is therefore defined by three parameters: its size, $r_h$, its galaxy index, $\chi^2_{\text{gal}}$, and its stellar index $\chi^2_{\text{star}}$.

### 4.3. Quality of the star/galaxy classification

In order to assess the accuracy of the method we tested our selection against a strict spectroscopic selection. We defined the incompleteness of the parent galaxy sample as the number of galaxies lost after the selection compared to the number of galaxies and the star contamination of the final galaxy sample as the number of stars misidentified as galaxies compared to the number of estimated galaxies.

At $i'_{AB} < 21$, stars are purely selected with their sizes. At fainter magnitude, we defined a galaxy as an object with $r_h \geq \mu_{r_h} + 3\sigma_{r_h}$, or $\chi^2_{\text{gal}} < \chi^2_{\text{star}}/2$ (“or” is used to have a galaxy sample as complete as possible). Stars are defined as $r_h < \mu_{r_h} + 3\sigma_{r_h}$ and $\chi^2_{\text{star}} < 2\chi^2_{\text{gal}}$. We stopped the selection at $i'_{AB} > 23$, where all objects are flagged as galaxies.

Table 4 shows the results in the D1, W1 and W4 fields. The star contamination is strongly reduced even for the fields where the proportion of stars is more than 50%.

![Fig. 9. $\chi^2$ distributions for “true” stars and “true” galaxies (according to the VVDS Wide spectroscopy) in the field W4. Top: all objects. Middle: objects larger with $r_h > r_{\text{limit}}$. Bottom: objects with $r_h < r_{\text{limit}}$. If used alone, the $\chi^2$ selection or the $r_h$ selection lead to misidentification. On optimal way to separate stars from galaxies is to combine the two pieces of information.](image)

The methods works the best with a small “PSF”, leading to a small $r_{\text{limit}}$ ($< 2.5 \text{ pixels}$).

The colour-based selection is helpful to keep the galaxy sample as complete as possible where the “PSF” is large, e.g., $r_{\text{limit}} \sim 3 \text{ pixels}$ (the incompleteness being 10% instead of 3%, otherwise).

### 4.4. Conclusion

The need for an accurate star/galaxy selection has arisen from the W4 field, where numerous stars contaminate the galaxy sample. We showed that the star/galaxy separation is simple for bright objects ($i'_{AB} < 21$) but becomes less reliable when faint, small objects are mixed together. We used the spectroscopic sample to build up and to assess a reliable estimator for the nature of an object, using both the size and color of objects. We succeeded in keeping an incompleteness always below 3% (in the worse “PSF” case) while we significantly reduced the star contamination (from 50% down to 7% in average). In the best cases (small “PSF” and a few stars in the field), the method reaches 1.1% of star contamination with less than 1% of incompleteness.

### 5. Photometric redshift analysis

From this Section onwards we consider only “reliable” photometric redshifts. These are defined as redshift of a source estimated from five photometric bands located in unmasked regions and which fulfilled passed the size-SED star-galaxy classification described in the previous Section. The source must be in the following magnitude range: $17.5 < i'_{AB} < 24$ for the Deep fields and $17.5 < i'_{AB} < 22.5$ for Wide fields. Hereafter we focus on the reliable photometric redshift samples to assess the quality redshift catalogues, to derive error estimates and compute the the redshift distribution in both the Wide and Deep fields.
Fig. 8. Star/galaxy separation in one tile of the W1 field, 022539-041200 (left panel), and one from the W4 field, 221706+002300 (right panel). Top: $r_h$ distribution and the corresponding gaussian fitting. The red line is the $\mu_r + 3\sigma_r$ cut. Bottom: $i'_{AB}$ vs $r_h$ in pixels. Squares and asterisks are VVDS-Wide spectroscopically identified stars and galaxies respectively. Both fields have different specifications; W1 overlaps with a deeper spectroscopic sample and has a low stellar density, whereas W4 has a larger proportion of stars but a brighter spectroscopic limit.

Table 4. Star/galaxy selection results, the table shows the galaxy incompleteness (Inc.) and the star contamination (Cont.) for the W1 field, with a large PSF size and the highly star crowded field, W4. “Stars” represents the intrinsic proportion of stars in the field.

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5.1. Error estimates

“Le Phare” computes an estimate of the photometric redshift uncertainty from the redshift Probability Distribution Function (PDF) of each object. By determining the redshifts where $\Delta \chi^2(z) = \chi^2(z) - \chi^2_{\text{min}} = 1$, we determine a low ($z_{\text{left}}$) and a high ($z_{\text{right}}$) redshift value corresponding to a 68% confidence interval.

We define the error estimated by “Le Phare” $\sigma_{zp}$ as follows:

$$\sigma_{zp} = \frac{|z_{\text{left}}(68\%) - z_{\text{right}}(68\%)|}{2}.$$  \hspace{1cm} (1)

The reliability of this error estimate is examined as follows. We first compare $\sigma_{zp}$ to the variance of the difference between spectroscopic and photometric redshifts $\Delta z$: We then use $\sigma_{zp}$ to assess the accuracy of the photometric redshifts over the entire range of magnitudes and redshifts. Figure 10 shows the distribution of $\Delta z$ for the wide W1, W3 and W4 fields (left) and for the deep D1 and D3 (right) fields. On this Figure is overlaid a Gaussian with a mean of zero and a standard deviation equal to the dispersion derived from the data, that is $\sigma_{\Delta z}$ = 0.038 and $\sigma_{\Delta z} = 0.029$. A very good agreement is found in the Deep and Wide fields demonstrating that the errors are nearly Gaussian. The distribution shows an extended tail and depart from the Gaussian approximation for large errors which is caused by the outliers. The distribution shows a slight bias in the Wide field only of $\Delta z_{\text{sys}} = \text{median}((z_p - z_{\text{sys}})/(1 + z_{\text{sys}})) = -0.005$. A closer look at the bias as a function of the magnitude shows slightly underestimated photometric redshifts for very bright objects ($i'_{AB} < 20.0$) and overestimated photometric redshifts at fainter magnitude (see table 5), but this bias is always less than 1%.

The cumulative distributions of the estimated errors compared to the photometric/spectroscopic error can also be computed. Assuming a Gaussian errors distribution we expect that 68% of the objects have a photometric redshift within the range $z_s \pm 1\sigma_{zp}$, recalling that $\sigma_{zp}$ is the uncertainty estimated by “Le Phare”. Figure 11 shows the cumulative distribution of
Fig. 10. Histogram of $\Delta z$ for the Wide (W1,W3 and W4, left) and the Deep (D1,D3, right) fields. A Gaussian function with a mean of and a dispersion corresponding to the photometric redshift dispersion is superimposed. In both cases the error distribution is very well represented by this Gaussian function.

Table 5. Median photometric redshift bias in magnitude slices in the field W1.

| $i'$ AB | $\Delta z_{sys}$ |
|---------|------------------|
| 17.5-20.0 | 0.0070 |
| 20.0-20.5 | -0.0016 |
| 20.5-21.0 | -0.0055 |
| 21.0-21.5 | -0.0080 |
| 21.5-22.0 | -0.0078 |
| 22.0-22.5 | -0.0073 |

$|z_p - z_s|/(1\sigma_{zp})$. From the two panels, we find that 71.3% of sources in the Wide and 70.8% in the Deep satisfy the relation $|z_p - z_s| < 1\sigma_{zp}$, showing the reliability of the Gaussian approximation of error estimates. For the remainder of this work photometric redshift errors will be derived from $\sigma_{zp}$ of “Le Phare”.

We can use this error model to investigate the accuracy of photometric redshifts over the complete magnitude and redshift ranges of our catalogues. Figure 12 shows the fraction of photometric redshifts in the Deep survey with $\sigma_{zp} < 0.15 \times (1+z_p)$ as function of $i'$ AB apparent magnitude. For photometric redshifts without outliers one would expect to find almost all objects in this range. As seen from the comparisons with spectroscopic redshifts a small number of objects have catastrophic errors at $z < 0.2$ and $z > 1.5$ where degeneracies in the colour-template space becomes important.

The solid and dotted lines show the photometric redshift errors for the galaxies in common between T0003 (I06) and T0004 (this work). Both studies show comparable results with a slight improvement in T0004 for $z > 0.2$.

The comparison between photometric redshift errors in Wide and Deep fields is shown in Figure 13. 95% of sources have an error within $\pm 0.15 \times (1+z_p)$, for $i'$ AB < 24 in the Deep field and $i'$ AB < 22.5 in the Wide fields. This result is consistent with the comparisons with spectroscopic redshifts where the outlier rate never exceeds 5%.

The dependence of photometric redshift errors on redshift is illustrated in figure 14. As already pointed out in I06, the photometric redshift errors in the Deep survey is lowest for $z < 1.5$. 

Fig. 12. Photometric redshifts errors as function of magnitude and redshift for the Deep fields for this study (solid line) and for I06 (dotted line).
Fig. 11. Cumulative errors for the Wide (W1, W3 and W4) and the Deep (D1, D3) fields. As expected for a Gaussian error distribution, the photometric redshifts fall within $z_S \pm 1\sigma_z$ 68% of the time where $1\sigma_z$ is the estimated error.

5.2. Redshift distribution

The redshift distributions of the T0004 Deep and Wide sources were derived from the histogram of photometric redshifts.

We took into account three sources of uncertainties in the redshift distribution: the uncertainties on the photo-z, the cosmic variance and the Poisson errors.

We derived the photo-z uncertainties on the redshift bins as follows. Following Fu et al. (2008), we model the PDF by a normalised Gaussian distribution with $\rho = \left| z_{\text{left}}(68\%) - z_{\text{right}}(68\%) \right| / 2$ and mean $z_p$ for each galaxy. From each individual PDF we randomly drew a redshift and built the histogram of the redshift distribution for the whole sample. We repeated the process 100 times and computed the dispersion for each redshift bin.

Cosmic variance and Poisson errors are combined into one single error value, where the field-to-field variance is estimated directly from the data. In the Deep field, we simply computed the field-to-field scatter over the four independent fields and divided it by $\sqrt{4}$. In the Wide field, the effective area is different for W1, W3 and W4, so we estimated the field-to-field variance in a different way. We cut W1 into compact subareas and computed the field-to-field variance as function of their angular size (see Fig. 10). We then extrapolated the results to derive the field-to-field variance corresponding to the full size of each Wide field. Due to a correlation between adjacent subareas, the field-to-field variance is likely understimated. As for the Deep field, we divided by $\sqrt{3}$ the error, assuming the 3 Wide fields are independent.

Finally we fit the redshift distribution by an analytic function. We use the parameterised form proposed by Van Waerbeke et al. (2001):

$$n(z) = \frac{\beta}{z_0 \Gamma \left( \frac{\alpha}{\beta} \right)} \left( \frac{z}{z_0} \right)^{\alpha-\beta} \exp \left( - \frac{\beta}{z_0} \right)$$

(2)

and we fit over the range $0.0 < z < 1.5$ for the Wide redshift distribution and over the range $0.0 < z < 2.5$ for the Deep one.

Table 6. Mean and median redshifts in the Deep and Wide fields, for several limiting magnitudes. Both values are computed directly from the data.

| $i_{\text{AB}}$ | Mean | Median |
|-----------------|------|--------|
| 20.5            | 0.36 | 0.34   |
| 21.0            | 0.40 | 0.37   |
| 21.5            | 0.46 | 0.42   |
| 22.0            | 0.51 | 0.47   |
| 22.5            | 0.58 | 0.54   |
| 23.0            | 0.65 | 0.62   |
| 23.5            | 0.74 | 0.70   |
| 24.0            | 0.84 | 0.77   |
| 24.5            | 0.93 | 0.83   |
| 25.0            | 1.00 | 0.88   |

Figure 16 shows the redshift distribution derived for the fields W1, W3, W4 and D1, D2, D3, D4 grouped in a Wide and Deep redshift distributions, respectively. As expected, the cosmic variance is lower in the Wide field which covers 35 deg$^2$.

We estimated the mean redshift of the Deep and Wide fields for several limiting magnitude. Table 6 shows the mean and median redshift computed directly from the data for several limiting magnitudes. As expected, the mean and median redshifts increase as the limiting magnitude of the sample increases.

The top panel of Figure 17 compares the Wide and Deep redshift distributions and their fit for a same magnitude selection at $17.5 < i_{\text{AB}} < 22.5$. The redshift distributions of the Deep and Wide fields agree well, when a same magnitude limit is adopted.

Conclusions

We computed photometric redshifts for the release T0004 of the Deep and Wide CFHT Legacy Survey produced by TERAPIX. In this work, only T0004 fields observed in all filters ($u'$, $g'$, $r'$, $i'$, and $z'$) relevant for photo-z studies have been selected. Our photometric catalogues cover four independent Deep fields of
We define “reliable” photometric redshifts as redshifts derived for sources classified as galaxies according to a joined size-SED star-galaxy classification criterion, located in unmasked regions with five-band photometric data and with $\chi^2_{\text{gal}} < 1000$. These objects have a magnitude in the range $17.5 < i'_{\text{AB}} < 24$ for the Wide and Deep samples, respectively.

In total, the photometric redshift catalogues contain 244,701 reliable redshifts in the Deep field within the magnitude range $17.5 < i'_{\text{AB}} < 24$ and 592,891 reliable redshifts in the Wide fields within the range $17.5 < i'_{\text{AB}} < 22.5$.

Our photometric redshift method is based on a SED template fitting procedure using the code “LePhare”. Following Ilbert et al (2006) spectroscopic redshifts were used to optimise our SED templates and to correct the systematic offsets between the observations and SEDs. A Bayesian prior is used to break the color-redshift degeneracies.

A total of 16,983 spectroscopic redshifts from the VVDS Deep, VVDS Wide, DEEP2 and zCOSMOS spectroscopic surveys provide a spectroscopic coverage for each field (except D4). The large quantity of spectroscopic data enabled an independent systematic offset correction for each field. A mean correction was applied to D4. These offsets vary only a small amount between the fields, on the order of 0.01 mag, demonstrating the excellent field-to-field stability of the CFHTLS photometry.

We estimated the accuracy of our photometric redshifts by comparing them to spectroscopic catalogues. The Deep field photometric redshifts were compared to the VVDS and DEEP2
spectroscopic samples limited at $17.5 < i'_{AB} < 24$. We found a stable dispersion of 0.028-0.030 and an outlier rate of about 3-4%. For the Wide fields, the dispersion is 0.036-0.039 and the outlier rate is about 3-4% in the range $17.5 < i'_{AB} < 22.5$ (comparing with VVDS Deep, VVDS Wide, zCOSMOS and DEEP2). The systematic bias between the input spectroscopic samples and the photometric redshifts derived with Le Phare keeps below 1% over $17.5 < i'_{AB} < 22.5$ for the Wide fields and no significant bias is found in the Deep fields. We noticed that the dispersion is constant or slightly increasing for $S/N > 40$, with a more significant increase at lower $S/N$ values. The outlier rate increases dramatically in the Wide beyond $i'_{AB} = 23$ (5% and 10% at $i'_{AB} = 23$ and $i'_{AB} = 24$). Our results are comparable to similar analyses done in the same CFHTLS Wide fields by Erben et al. (2008) and Brimioulle et al. (2008).

Each CFHTLS Wide field is composed of several 1 deg$^2$ tiles. Unfortunately, the spectroscopic coverage is not sufficient to perform a calibration of the systematic offsets for each tile. We investigated the effect of tile-to-tile photometric offsets on the accuracy of our photometric redshifts. Taking an uncertainty of 0.03 magnitudes for the photometric calibration in each band, we found that the photometric redshifts can be degraded up to 14% in the Wide and 21% in the Deep. Future wide-field spectroscopic surveys such as VIPERS will allow to reduce this problem.

Some catalogues in the Wide fields contain 50% of stars at $i'_{AB} < 22.5$. A reliable galaxy/star separation is important to scientifically exploit these catalogues. We combined both the size and multi-colour data to perform a robust star/galaxy separation. The star selection is purely based a size criteria for the brightest sources ($i'_{AB} < 21$). Since some galaxies are unresolved at fainter magnitudes, we added multi-colour information to avoid rejecting galaxies. Using the spectroscopic data to assess the quality of our classification, we found that our criteria reduces the stellar contamination from 50% (in W4, the field with the highest stellar density) to 7%, while keeping a galaxy sample more than 98% complete. Star contamination is as low as 1-2% in some other fields, like W1 or D1.

Finally, we used the spectroscopic redshifts to evaluate the 68% error estimate computed by “Le Phare” for the photometric redshifts. The error distribution, found to be very well approximated by a Gaussian, was in excellent agreement with the real phot-z dispersion. Confident with the 68% error estimate for each photometric redshift, we determined the accuracy of our photometric redshifts over a larger magnitude and redshift. Our photometric redshifts are most accurate in the range $0.2 < z < 1.5$.

The redshift distributions for the Deep and Wide fields have been modeled using empirical formula of Van Waerbeke et al. (2001). The distributions and the $z_{\text{median}}$ and mean $<z>$ de-
rived from the Deep and Wide samples are consistent with I06, Fu et al. (2008) as well as the recent CFHTLS-Wide studies of Erben et al. (2008) and Brimioulle et al. (2008).

The photometric redshifts calculated here will be an essential tool in realising the full potential of the CFHTLS survey. In particular, cosmological parameter estimation, galaxy-galaxy lensing, galaxy biasing studies and investigation of the halo occupation function for galaxies will greatly benefit from this homogeneous and well-calibrated set of photometric redshifts. Additionally, upcoming large spectroscopic surveys like VIPERS will benefit from the increased observing efficiency that pre-selection using photometric redshifts can offer.

Our CFHTLS T0004 Deep and Wide photometric redshifts are made available to the community through the Terapix and CENCODE databases.

Acknowledgements

We thank the CFHT, Terapix and CADC for their assistance and considerable work in producing the CFHTLS data. We also acknowledge the VVDS consortium for providing the spectroscopic redshift catalogues. This work has made use of the VizieR catalogue access tool, CDS, Strasbourg. We thank S. Colombi, T. Erben, H. Hildebrandt, B. Ménard, S. Seitz and L. van Waerbeke for useful discussions. MK is supported by the CNRS ANR “ECOSSTAT”, contract number ANR-BLAN-0283-04. We acknowledge the CNRS-Institut National des Sciences de l’Univers (INSU) and the French Programme National de Cosmologie (PNC) for their support for the CFHTLS. This research was supported by ANR grant “ANR-07-BLAN-0228”.

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