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Combining high-resolution satellite images and altimetry to estimate the volume of small lakes

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Abstract

This study presents an approach to determine the volume of water in small lakes (< 100 ha) by combining satellite altimetry data and high-resolution (HR) images. The lake being studied is located in the south-west of France and is only used for agricultural irrigation purposes. The altimetry satellite data are provided by RA-2 sensor 5 on board Envisat, and the high-resolution images (< 10 m) are obtained from optical (Formosat-2) and synthetic aperture radar (SAR) sensors (Terrasar-X and Radarsat-2) satellites. The altimetry data (data are obtained every 35 days) and the HR images (45) have been available since 2003 and 2010, respectively. In situ data (for the water levels and volumes) going back to 2003 have been provided by the manager of the 10 lake. Three independent approaches are developed to estimate the lake volume and its temporal variability. The first two approaches are empirical and use synchronous ground measurements of the water volume and the satellite data. The results demonstrate that altimetry and imagery can be effectively and accurately used to monitor the temporal variations of the lake $(R_{\text{altimetry}}^2 = 0.97, \text{RMSE}_{\text{altimetry}} = 5.2\%, R_{\text{imagery}}^2 = 0.90,$ 15 and RMSE_{imagery} = 7.4 %). The third method combines altimetry (to measure the lake level) and satellite images (of the lake surface) to estimate the volume changes of the lake and produces the best results ($R^2 = 0.99$) of the three methods, demonstrating the potential of future Sentinel and SWOT missions to monitor small lakes and reservoirs

for agricultural and irrigation applications. 20

Introduction 1

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Water supply issues are creating unprecedented pressures because of increasing population and economic demands. As irrigated agriculture represents 70% of global water consumption, managing water resources is a major concern in maintaining sustainable agricultural practices. Water management will become even more relevant in the future



as urbanisation, industrialisation, and climate change exert greater pressures on water

use (OECD, 2012). Water resources can be monitored at a global scale using three approaches: in situ measurements, modelling, and remote sensing observations (Jorgensen et al., 2005; Harding et al., 2011; Hall et al., 2011; Duan and Bastiaanssen, 2013). Given the dramatic decrease in the number of in situ gauges available in re-

- ⁵ cent years and the difficulty of modelling water resources at a global scale (because of complex mixing between inflows and outflows), measuring water stages by remote sensing and especially by satellite has become a major goal in hydrology for the coming decades (The Ad Hoc Group on Global Water Datasets, 2001; Alsdorf et al., 2007; Duan and Bastiaanssen, 2013).
- Satellite radar altimetry was originally developed to accurately measure ocean surface topography and has been successfully used to obtain valuable information for land hydrology by estimating the variation in lake water levels (Birkett, 1995; Cazenave et al., 1997; Crétaux et al., 2011), rivers (Birkett, 1998; Birkett et al., 2002; Frappart et al., 2006a; Santos da Silva et al., 2010), and floodplains (Frappart et al., 2006b, 2008; Santos da Silva et al., 2012). The accuracy of altimetry-based water levels can vary from 5 to 80 cm depending on the altimetry data used (i.e., from Topex/Poseidon and ERS-2 to Envisat and Jason-2), the size of the water bodies being flown over,
 - the configuration of the terrain, and the presence of vegetation (Frappart et al., 2005, 2006a, b; Santos da Silva et al., 2010; Crétaux et al., 2011; Ricko et al., 2012).
- However, comprehensive monitoring of surface resources also requires knowledge of the extent of the surface water and the water volume. Earth observation missions have been developed to provide images of the Earth's surface at various spatial, temporal, and spectral resolutions, which have been used to map land use and land cover dynamics over the last few decades (Kümmerle et al., 2013; Klein et al., 2014). Past,
- ²⁵ current (ALOS, ENVISAT, Formosat-2, Radarsat-2, Spot 4–5, TerraSAR-X...), and future (Radarsat Constellation, Sentinel 1–2, TerraSAR-L...) Earth observation missions offer high spatial resolution, frequent revisit times, and a unique opportunity to monitor the extent of global water resources, even small-sized resources. Among other applications, high-resolution images were recently used to inventory tank irrigation systems



in India (Abdul Hakeem and Raju, 2009), detect lakes and river courses in various environments (Strozzi et al., 2012; Karbouche and Clavet, 2013), and monitor the spatial distribution and temporal dynamics of wetlands (Zhou et al., 2010; White and Lewis, 2011).

- Recent studies have demonstrated the potential of combining satellite imagery and radar altimetry to estimate the volume of water stored in lakes, rivers, and floodplains and how these volumes change in response to climate variability and/or anthropogenic effects using SAR images, multispectral images, or multi-satellite observations (Frappart et al., 2005, 2006b, 2013; Yesou et al., 2007; Ding and Li, 2011; Haibo et al., 2011;
 Wang et al., 2011; Duan and Bastiaanssen, 2013). Despite the relevance of these re-
- sults, these techniques have not been applied to the study of small lakes.

In this study, we developed a method to estimate the water volume of small lakes (< 100 ha) by combining satellite altimetry and high-resolution imagery. The method was used to determine the variation in the volume of Lake "la Bure", a small reservoir

- (with an average area of 52 ha) located in an irrigated agricultural area in the southwest of France. This study is structured as follows: the primary characteristics of the study site, satellite data, and in situ data are presented in Sect. 1. In Sect. 2, three different methods are presented for estimating the water volume of the lake. The results are analysed and discussed in Sect. 3, in which the HR images, altimetry, and a combination of the two techniques is used to accurately actimate accessed.
- ²⁰ a combination of the two techniques is used to accurately estimate seasonal changes in the water volume. Concluding remarks and future work are presented in Sect. 4.

2 Study area and datasets

2.1 Study area

Lake "la Bure" (43°24′54″ N; 1°09′07″ E) is located in the south-west of France, close to the city of Rieumes (which is 40 km south-west of the city of Toulouse), in a study area monitored by CESBIO in the framework of the "Sud-Ouest" Project (Dejoux et al.,



2012; Baup et al., 2012; Fieuzal et al., 2012, 2013) (Fig. 1). The area has a temperate climate with a mean annual rainfall of approximately 600 mm. Rainfalls are regularly distributed (with a monthly mean of 50 mm), with a maximum of 80 mm in the spring and a minimum of 32 mm in the summer according to the records from meteorological

- station number 3145400 of Météo-France, the French Meteorological agency (http: 5 //www.meteofrance.fr). Inside the watershed (20.70 km²) of the lake, the relief is not clearly delineated (min = 0%, max = 16.9%, and mean slope = 2.8%), and the land use is composed of crops (40.90%), forest (24.02%), grassland (33.4%), and water bodies (1.68%). Lake "la Bure" is an artificial reservoir that was constructed in 1987
- for crop irrigation purposes. Since its construction, the barrage has been managed by 10 the SIAH (Syndicat Intercommunal d'Aménagement Hydraulique de la vallée du Touch et de ses affluents) company. The extent of the lake can reach 52 ha for a maximum water volume of 4 million m³. The charge and discharge of the lake only occur via rainfall events (throughout the year) and irrigation pumping (primarily in the summer).
- The lake is located under Envisat RA-2 altimetry track 773 and is inside the footprint 15 of three high-resolution images that are acquired by the Formosat-2, TerraSAR-X, and Radarsat-2 satellites.

2.2 Satellite data

The satellite data used in this study were composed of HR images and altimetry data.

Forty-five HR images were acquired in 2010, between January and November. by 20 sensors on board three different low-orbiting satellites (Radarsat-2, TerraSAR-X, and Formosat-2) (Fig. 2). Thirty-three of these images were acquired in the microwave domain using SAR instruments (Radarsat-2 and TerraSAR-X), and 12 were acquired using the multispectral mode of the Formosat-2 satellite. The altimetry data were ac-





2.2.1 SAR images

The SAR images were acquired at X- and C-bands by TERRASAR-X and RADARSAT-2, respectively (Table 1).

TerraSAR-X is a German Earth observation satellite that was launched in June 2007

- ⁵ (Fritz et al., 2008; Breit et al., 2010). The SAR instrument on board the satellite operates in the X-band (f = 9.65 GHz and $\lambda = 3.1 \text{ cm}$). All of the images (which numbered 18 in 2010) were provided by the German Aerospace Centre (DLR) and were acquired with the same polarisation state (HH) for incidence angles ranging from 27.3° to 53.3° to increase the repetitiveness of observations from an initial 11 day orbital cy-
- ¹⁰ cle. Two acquisition modes were combined: StripMap (SM) and SpotLight (SL), which were characterised by pixel spacings of approximately 3 and 1.5 m, respectively. The backscattering coefficients were calculated using Eq. (1) (Lavalle, 2009):

$$\sigma_{pq}^{O} = 20\log\left(\mathsf{DN}_{pq}\right) + 10\log\left(\mathsf{CF}_{pq}\right) + 10\log\left(\sin\left(\theta\right)\right)$$

where DN denotes the digital number of pixels, CF denotes the calibration factor, and θ denotes the incidence angle. The indexes *p* and *q* denote the linear polarisation states of the electromagnetic wave (H or V), respectively.

The Canadian satellite Radarsat-2 was launched in December 2007 (Morena et al., 2004). Its payload encompasses a SAR instrument operating in the C-band (f = 5.405 GHz and $\lambda = 5.5 \text{ cm}$). The orbital cycle of the satellite is 24 days, but different orbit and incidence angles can be combined to increase the numbers of possible acquisitions per cycle. The images (which numbered 15 in 2010) were provided by the Canadian Space Agency through the SOAR (Science and Operational Application Research) program and were all acquired in full quad-polarisation mode (Fine Quad-Pol: HH, VV, HV, and VH). The incidence angles ranged from 23° (FQ5) to 41° (FQ21) with a pixel spacing of 5 m. The images were calibrated using NEST software (NEST, 2013) and Eq. (2) (Skriver et al., 1999):

$$\sigma_i^O = 20 \log_{10} \left(DN_i / A2_i \right) + 10 \log_{10} \left(\sin(\theta_i) \right)$$
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(1)

(2)

where DN_i denotes the digital number of the pixel "*i*", θ denotes the incidence angle, and *A*2 denotes the gain (which is provided by the image product data table).

All of the SAR images were geo-referenced using aerial IGN ortho-photos (with a spatial resolution of 50 cm). The ortho-photos were first resized to the resolution

of the image and then 70 reference points were taken between the base (IGN orthophotos) and wrap images (satellite data). The geo-location accuracy was under 2 pixels (i.e., 3 to 6 m) on average for the different products. Finally, all of the radar images were filtered to reduce speckle effects using a Gamma filter with a filtering window of 6 by 6 pixels.

10 2.2.2 Optical images

The optical images (12) were provided by the Taiwanese Formosat-2 satellite (which was launched in 2004) for four narrow wavelengths between 0.45 and 0.90 μ m corresponding to the blue, green, red, and near-infrared ranges (Liu, 2006; Chern et al., 2008, Table 1). All of the images used in this study were acquired in multispectral mode (MS) with a theoretical daily orbital cycle (sun-synchronous orbit) at the same viewing angle (±45°). This mode was characterised by a spatial resolution of 8 m for a scene coverage of 24 km × 24 km. All of the images were ortho-rectified using CNES orthorectification tools. Cloud detection and atmospheric correction were also applied (Sand et al., 2006; Hagolle et al., 2010).

20 2.2.3 Altimetry data

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RA-2 (Advanced Radar Altimeter) is a nadir-looking pulse-limited radar altimeter on board ENVISAT that operates at two frequencies: the Ku-band (13.575GHz/wavelength of 2.3 cm) and the S-band (3.2GHz/9.3 cm) (Zelli, 1999). The Geophysical Data Records (GDRs) distributed by ESA (ESA, 2002) include accurate satellite positions (i.e., the longitude, latitude, and altitude of the satellite in its orbit) and timing; altimeter ranges; instrumental, propagation, and geophysical corrections



applied to the range; and several other parameters used to build altimetry-based water levels. For the ENVISAT mission, four different retracking algorithms are operationally applied to RA-2 raw data to provide range estimates and backscattering coefficients. Each retracking algorithm, namely Ocean, Ice-1, Ice-2, and Sea-Ice, has been developed for a specific type of surface, but none of these algorithms has been specific

- ⁵ oped for a specific type of surface, but none of these algorithms has been specifically designed for processing altimeter echoes over land (Brown, 1977; Wingham et al., 1986; Laxon, 1994; Legrésy and Rémy, 1997). Previous studies have shown that the Ice-1 algorithm measures the water levels of small lakes and reservoirs, rivers, and floodplains most accurately (Frappart et al., 2006a; Santos da Silva et al., 2010;
- Ricko et al., 2012). In this study, the altimetry measurements contained in the EN-VISAT RA-2 GDRs were made available by the Centre de Topographie des Océans et de l'Hydrosphère (CTOH – http://ctoh.legos.obs-mip.fr/) for February 2002 to October 2010 (cycles 8 to 93), corresponding to the reference repetitive orbit of the satellite.

2.3 In situ data

- ¹⁵ The monthly rainfall data came from the records of weather station number 3145400, which is located less than five kilometres from the centre of the lake and is operated by the French meteorology Agency (Météo France). The relationship between the water levels and the volume of water stored in the lake was established in 1987 when the lake was dug (Fig. 3). More recent information on the storage capacity of the lake is
- available from bathymetric surveys that were performed in 2010 by AEAD ("Agence de l'Eau Adour-Garonne", which depends of the Ministry of Ecology, Sustainable Development, and Energy). The water levels were recorded at two different time steps, pressure probes were used to obtain automatic weekly measurements, and monthly data were provided by gauge readings. Figure 4 shows the temporal variations in the volume
- of water stored in Lake "la Bure" over the study period. The difference between the volume obtained from the in situ water levels and the volume obtained from the bathymetric survey performed in 2010 was less than 2 %. This difference was attributed both



to the accuracy of the bathymetric measurements and to possible siltation. Various characteristics of the available ground data are summarised in Table 2.

3 Methodology

Figure 5 summarises the methods used to monitor the water volume of Lake "la Bure". The satellite data acquired within the optical and microwave domains were processed to estimate the water surfaces (using HR images) and levels (using altimetry) throughout the hydrological cycle. The temporal variations in the volume storage of the lake was finally estimated by combining one type of satellite data (HR images or radar altimetry) with ground measurements or using two types of complementary satellite data.

3.1 Determination of the extent of the lake area from satellite imagery

An automatic parallelepiped classification was performed using ENVI software on each HR image to determine which pixels could be associated with open water (Richards, 1999; ENVI, 2004; Lillesand et al., 2008). This supervised classification method relied on a simple logical rule to classify a given pixel based on its radiometry (4 channels are considered: blue, green, red, and near infra-red). The decision boundaries formed a 4-dimensional parallelepiped in the image data space. Each class was defined in terms of a threshold for the standard deviation from the mean of each training site (i.e., the region of interest). Four classes were identified as being representative of the landscape: forests, open water, bare soils, and crops. Once the classification process was completed, all of the surface elements that were identified as open water were vectorised and exported to an ArcGIS shape file format in which the boundary represents the lake shoreline (artefacts in the polygon that represented open water were suppressed using the FillHoles toolbox of the software). Figure 6 shows the temporal variations in the lake shoreline for four different dates in 2010 that were acquired by the Radarsat-2 satellite. 25



3.2 Altimetry-based water levels

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The principle behind radar altimetry is as follows: the altimeter emits a radar pulse and measures the two-way travel-time from the satellite to the surface. The distance between the satellite and the Earth surface – the altimeter range (R) – is thus derived

⁵ with a precision of a few centimetres. The satellite altitude (H) with reference to an ellipsoid is also accurately known from orbitography modelling. Taking into account propagation delays from the interactions of electromagnetic waves in the atmosphere and geophysical corrections, the height of the reflecting surface (h) with reference to an ellipsoid or a geoid can be estimated as follows:

¹⁰
$$h = H - R - C_{\text{ionosphere}} - C_{\text{dry troposphere}} - C_{\text{wet troposphere}} - C_{\text{solid Earth tide}} - C_{\text{pole tide}}$$
 (3)

where $C_{\text{ionosphere}}$ is the correction for delayed propagation through the ionosphere, $C_{\text{dry troposphere}}$ and $C_{\text{wet troposphere}}$ are corrections for delayed propagation in the troposphere from pressure and humidity variations, respectively, and $C_{\text{solid Earth tide}}$ and $C_{\text{polar tide}}$ are corrections that account for crustal vertical motions from the solid and polar tides, respectively.

An altimetry station, which is the equivalent of an in situ water level gauge, can be defined at each intersection between a lake, a river, or a floodplain and the satellite ground-track. For each altimeter pass or cycle, the altimetry measurements are processed using the three following primary steps to obtain a water level: a 2-D selection

- is made from the data contained in the window corresponding to the altimetry station using satellite imagery; the altimetry heights from Eq. (3) are filtered (at varying degrees of complexity depending on the approach chosen) using a statistical and/or hydrological criterion; and the altimetry-based water level is computed using estimates of either the median or the mean of the selected altimetry heights, which may or may
- not have been corrected for hooking effects (Frappart et al., 2006a; Santos da Silva et al., 2010). This process is repeated for each cycle to construct a water level time-series at the altimetry station. In this study, Virtual ALtimetry Station (VALS) software



was used to derive the time-series of water levels for Lake "la Bure" from ENVISAT RA-2 data from February 2002 to October 2010. The processing of altimetry data using VALS consisted of three primary steps:

- 1. a coarse selection of the altimetry data over the water body contained in a polyline using Google Earth was obtained,
- 2. the VALS visualisation tool was used to obtain a refined selection of the valid altimetry-derived water levels in which outliers were removed and the hooking effects were likely to becorrected for and
- 3. the time-series of water levels was computed using the median value of all of the valid altimetry-based water levels for each cycle.

Further details on processing the altimetry data using VALS software can be found in Santos da Silva et al., 2010. At the end of the process, 70% of the data remained.

3.3 Lake volume estimates

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Three independent approaches were developed to estimate the lake volume and its temporal variability. In the first two methods, an empirical relationship between either the lake surface derived from the HR images or the altimetry-based water levels and quasi-synchronous estimates of the lake volume was determined from the in situ water level measurements. In the third method, the lake surface from the HR images was combined with altimetry-based water levels that were acquired quasi-synchronously to estimate the volume of the lake. A combination of satellite products was used to

estimate the change in the lake volume from both the variation in the water level and the surface. To this end, the lake of interest was modelled as a simple geometric shape, for which the variation in the water volume (ΔV) between two dates (t_1 and t_2 , respectively)



was computed using Eqs. 4 and 5:

If
$$\Delta H > 0$$
 then $\Delta V = S(t_1) \cdot \Delta H + (\Delta H \cdot \Delta S)/2$

f
$$\Delta H < 0$$
 then $\Delta V = -((S(t_1) - |\Delta S|) \cdot \Delta H + (\Delta H \cdot \Delta S)/2)$

⁵ where $\Delta H = H(t_2) - H(t_1)$ and $\Delta V = V(t_2) - V(t_1)$ denote the difference in the water levels (*H*) and the volume between two dates, t_1 and t_2 , respectively. $\Delta S = S(t_2) - S(t_1)$ denotes the variation in the surface between the two dates.

4 Results and discussion

4.1 Estimating the lake volume using HR images

Figure 7 shows the temporal evolution of the water surface of Lake "la Bure" for the complete series of 45 HR images that were acquired in 2010. The lake surface was estimated by applying the method presented in Sect. 3.1 to the Formosat-2, Radarsat-2, and TerraSAR-X images that were acquired in 2010. The measurement of the temporal behaviour of the lake surface from the three sensors was highly consistent and ranged between 42 and 52 ha. The difference between the three estimates never exceeded 3.94 ha (for an RRMSE of 8.5%) and equalled 0.51 ha (which was 1.1% of the mean water surface) when averaged over the complete period of observation for the quasi-synchronous satellite acquisitions (i.e., time-lags below 5 days).

The annual cycle of the open water surface consists of two phases: the filling of the lake (from the end of September to mid-June) and the emptying of the lake (during the summer). The filling of the lake only occurs through rainfall events (primarily from runoff inside the watershed). The lake surface significantly increases over this period. No additional pumping is needed to fill the lake more rapidly, unlike some of the other lakes in the region studied. The lake empties during the irrigation period, which occurs

²⁵ between July and October (Fig. 7). In the summertime, the low amount of rainfall is not sufficient to compensate for losses from irrigation and evaporation.



(4)

(5)

Figure 8 shows an empirical relationship between the estimates of the lake surface from the HR images and the volume measurements. The relationship is clearly nonlinear (i.e., a 2nd-order polynomial function) with a coefficient of determination of 0.90 and a mean error of $200\,000\,\text{m}^3$ for the volume estimates (i.e., 7.4% of the average water volume in 2010). In agreement with the bathymetric measurements, the surface changed dramatically (from 40 to 44 ha) for small volume changes between 2.2 and 2.5 hm³ when the filling began (sensitivity of $80\,000\,\text{m}^3\,\text{ha}^{-1}$). The relationship is fairly linear for volume changes from 2.5 hm³ to greater than 4 hm³, with a higher sensitivity compared to the beginning of the filling phase (237\,000\,\text{m}^3\,\text{ha}^{-1}).

4.2 Estimating the lake volume from altimetry

4.2.1 Validation of altimetry-based water levels

The altimetry data (RA-2) were validated by directly comparing the altimetry-based water levels with the in situ water levels from gauge measurements made by the Lake Management Institute (SIAH) over the 2003–2010 period (Fig. 9). Similar temporal variations were observed for both datasets, in which the in situ water levels exhibited annual (peak to peak) amplitudes between 2.65 m (2007/2008) and 5.36 m (2003/2004). Both the seasonal variations (i.e., the maxima from May to June and the minima from September to October) and the inter-annual variations (i.e., the minimum during the drought of 2003) were also successfully detected. Although the difference between the in situ and altimetry-derived water levels reached 1.3 m one time, it did not exceed 0.3 m in 75 % of the cases studied. The RMSE and *R*² were equal to 0.31 m and 0.99,

respectively, showing that the two sources of data were in very good agreement. The results obtained in this study were comparable to results for large lakes (Crétaux and Birkett, 2006; Ricko et al., 2012; Duan and Bastiaanssen, 2013) and large rivers (Frap-

part et al., 2006a; Santos da Silva et al., 2010) and were better than those obtained for various small rivers (Santos da Silva et al., 2010).



4.2.2 Pluri-annual water volume estimates

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Figure 10 shows the empirical relationship that was obtained between the groundmeasured volumes and the altimetry-derived water levels. Sixty-five measurements were used from the period between 2003 and 2010 to obtain a 3rd-order polynomial that related the altimetry-based water levels to the water volume stored in the lake. The statistical parameters highlighted the quality of the regression ($R^2 = 0.97$, RMSE = 0.14 hm³, and RRMSE = 5.3 %). No yearly dependence was observed, confirming the temporal stability of the method.

For subsequent comparison with the HR images, a specific empirical relation-¹⁰ ship relating altimetry-based water levels to water volumes was determined for 2010 (Sect. 4.3). Figure 11 compares the water volumes that were estimated using these two relationships. The results were very similar, although the results obtained using the empirical function that was determined using over 8 yr of altimetry data were slightly more accurate than those obtained using the empirical function for 2010 (Table 3). The lake ¹⁵ volume estimates never exceeded 0.17 hm³ and corresponded to a high coefficient of determination ($R^2 \ge 0.96$) and a low relative error (i.e., the mean lake volume had an RRMSE of 6.4 %).

4.3 Combined use of HR images and altimeter data

In this section, we show how variations in the lake volume were obtained by combining the HR images (Sects. 2.2.1 and 2.2.2.) with the altimetry-derived water levels (Sect. 2.2.3). This approach was validated for 2010, for which satellite images and altimetry data were simultaneously available to compare with in situ measurements of the lake volume. Figure 12 shows the temporal variations in the lake volume that were estimated using three different methods: ground measurements (SIAH), HR images (Sect. 3.1.), and altimetry-based water levels (Sect. 3.2.). In 2010, the emptying and refilling phases of the lake were accurately detected and reproduced by both the satellite estimates. The errors were equal to 0.20 and 0.14 hm³ using the HR images and



the RA-2 data, respectively. All of the altimeter-derived volumes had an error below 5 % of the measured volume; whereas only half of the HR-image-based volume estimates reached this level of accuracy. The precision for the estimated lake volume obtained using all of the satellite products was always below 19%. Figure 13 shows the relation-

ship that was estimated between the water level obtained using the satellite products (from RA-2) and the water surface (from the HR images). Only the satellite acquisitions that were performed guasi-synchronously (for a time-lag below 5 days) were retained to reduce the signal scattering because of the potential variation in the lake properties (i.e., the surface, level, and volume) between the images and the altimeter acquisitions. The two satellite products were strongly linearly correlated with a high coefficient 10

of determination $(R^2 = 0.94)$.

Figure 14 shows the relationship that was obtained between the variations in the volume estimated using the ground measurements and the satellite products. Five dates were retained in accordance with the two following constraints:

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- the satellite acquisitions were performed in 2010,

- the altimetry data and HR images were acquired for a time lag below 5 days (so implying that ΔV was less than 0.7% of the average volume during this period using the relationship between the water levels and the water volumes stored in Lake "la Bure", as shown in Fig. 3).
- The ground-based estimates of the variations in the water volume shown in Fig. 14 20 were in very good agreement with the results from this approach (i.e., $R^2 = 0.98$, $RMSE = 0.06 \text{ hm}^3$, and the linear regression slope was close to 1). The major drawbacks of this method are its low temporal resolution, which depends on the availability of data obtained around the same time period from both satellites, and the fact that only variations in the volume and not the volumes themselves can be determined. Fig-25
- ure 14 also shows the estimates of the variations in the water volume from the BA-2 altimetry-based water levels and the in situ data, and the HR images and the in situ data for the same dates. The two estimates were in very good agreement with the volume



derived from the in situ data ($R^2 = 0.95$ and RMSE = 0.17 hm³ for altimetry-based volume variations and $R^2 = 0.90$ and RMSE = 0.25 hm³ for the HR-image-based volume variations); however, more accurate results were obtained by estimating the water volumes using altimetry and imagery. These results need to be confirmed for longer timeseries. The results confirmed the efficacy of these products to estimate the temporal 5 volume changes of the lake ($R^2 \ge 0.90$). A strong limitation of the last two relationships is that they require in situ data.

Conclusion and perspectives 5

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This study demonstrated the high potential of remotely sensed observations (HR images and radar altimetry) for accurately monitoring the surface volume of small lakes 10 and reservoirs (i.e., with areas < 100 ha). Three different approaches were developed that combined guasi-synchronous multi-satellite data and/or in situ measurements to monitor the temporal variations in water resources. All of these methods provided reliable estimates of the variations in the water volume with an average accuracy greater than 7.4% of the average volume. 15

In the first method (Sect. 4.1.), the water surface estimates were converted from multispectral HR images into water volumes using in situ measurements. For our study site, this method enabled the volumes of water stored in the lake on a weekly basis to be monitored continuously. The high correlation ($R^2 = 0.90$) was associated with a good average accuracy of 200 000 m³ (i.e., 7.4 % of the average volume of Lake "la Bure") of the results, thereby confirming the applicability of this method.

In the second method (Sect. 4.2.), altimetry-based (from ENVISAT RA-2) water levels were similarly combined with ground measurements to estimate the water volumes stored in the lake. This method produced more accurate estimates of the water volumes than the previous method with an average accuracy of 140 000 m³ (i.e., 5.2% of the





this approach was the low temporal resolution (below one month) of the satellite data. These two methods cannot be generalised because they require in situ data.

Finally, in the third method (Sect. 4.3.), almost-synchronous satellite estimates of water surfaces and levels were used to estimate the variations in the water volume.

⁵ This approach did not require any in situ measurements and produced promising results ($R^2 = 0.98$), which were better than those obtained using the first two approaches. However, the third method is currently limited by the poor availability of quasi-synchronous remotely sensed observations. In addition, the third method can only be used to calculate changes in the volume and cannot be used to estimate the volume itself. This latter drawback could be overcome by using lake bathymetry.

These results can be used to monitor and manage water resources, especially for agricultural purposes and even for small lakes and reservoirs. A higher spatial resolution and temporal repetitiveness allowing higher quasi-synchronous acquisitions could be achieved by using additional data from current and future satellite missions. Future

- ¹⁵ launches of Sentinel-1, 2, and 3 will provide access to multispectral and SAR HR images combined with a dense temporal sampling (Le Roy et al., 2007; Berger et al., 2012). For radar altimetry, higher accuracy can be expected from the Saral-AltiKa mission over small water bodies because the footprint of the Ka band is smaller than that of the Ku band from current missions. The development of SAR-altimeter (Cryosataction of the Ku band from current missions. The development of the Ka band is smaller than that
- 20 2, Sentinel-3, Jason CS) and SAR-interferometry (SWOT) techniques for altimetry will densify the spatial coverage of radar altimetry over land and ocean, offering high spatial and temporal resolution (ESA Communications, 2012a; ESA Communications 2012b).

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Table 1. Characteristics of the electromagnetic waves of satellite sensors (in optical and microwave frequencies).

Satellite	Frequency/wavelength	Mode	Polarisation states	Range of incidence angle
Radarsat-2	C-band ($f = 5.405 \text{GHz}$)	FQ	HH, VV, VH, HV	23° to 41°
Terrasar-X	X-band ($f = 9.65 \text{GHz}$)	SM/SL	HH	27° to 53°
Formosat-2	λ: 0.44–0.90 μm	Multi-spectral	_	±45°

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 Table 2. Summary of ground data used.

Ground data	Dates	Sampling frequency
Lake calibration function (abacus)	ln 1987	_
Bathymetric draw	In 2010	-
Water level	since 2003	Weekly
Rainfall	since 2006	Daily



Table 3. Evaluation of the yearly dependence of the calibration function used to estimate the lake volume from the water level measured by the satellite. Two calibration functions were considered: annual (2010) and pluri-annual (2003–2010).

Period of the estimated calibration function	Number of points	R ²	RMSE (hm ³)	RRMSE (%)
2010	65	0.96	0.17	6.4
2003–2010	65	0.97	0.14	5.2



Fig. 1. Lake "la Bure" is located in the south-west of France 40 km south-west of Toulouse **(a)**, within the footprint of TERRASAR-X (white empty rectangle), RADARSAT-2 (dotted empty rectangle), and FORMOSAT-2 (empty rectangle of crosses) and under ENVISAT RA-2 altimetry track 773 **(b)**; the black dots represent 20 Hz altimetry measurements over Lake "la Bure" **(c)**.





Fig. 2. Timeline for acquisition of high spatial resolution satellite images in 2010.





Fig. 3. Relationship between in situ water levels and the volumes of lake "la Bure" established in 1987.





Fig. 4. Temporal variations of the local rainfall and measured water volume of Lake "la Bure" (black dots) from 2003 to 2011.



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Fig. 5. Flowchart showing the processing steps used to estimate the volume of Lake "la Bure" using high-resolution images (HR), radar altimetry (RA-2), and ground data for each of the three methods.





Fig. 6. Examples of temporal evolution of the lake shorelines resulting of the supervised classification of Radarsat-2 image: the green, blue, yellow, and pink lines represent the lake shoreline on 31 May, 23 June, 11 November, and 30 September 2010, respectively; the orange line to the east of the lake represents the theoretical groundtrack of the Envisat altimeter.





Fig. 7. Temporal evolution of water surface of lake "la Bure", as estimated by HR satellite images in 2010 (TerraSAR-X data are shown as black squares, Radarsat-2 as gray circle, Formosat-2 as black stars and irrigation period as gray rectangle).











Fig. 9. Comparison of satellite-estimated (RA-2) and ground-measured (SIAH) time series of the water level of lake "la Bure" from 2003 to 2010.





Fig. 10. Empirical relationship between the satellite water level (RA-2) and the measured (SIAH) water volume of lake "la Bure" from 2003 to 2010. Each year is colour-separated.





Fig. 11. Comparisons of temporal evolution of water volume of the lake of interest, estimated by using two calibration functions: annual (2010) and pluri-annual (2003–2010). The differences between these results and the ground measurements are also shown.











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(altimetry) acquired with a time lag of less than 5 days.



Fig. 14. Comparison between the variation in the water volume estimated by satellite data and ground-measured (SIAH) data in 2010.

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