

Validation and intercomparison of Persistent Scatterers interferometry: PSIC4 project results

Daniel Raucoules, Bernard Bourgine, Marcello de Michele, Gonéri Le Cozannet, Luc Closset, C. Bremmer, H. Veldkamp, D. Tragheim, L. Bateson, M. Crosetto, et al.

▶ To cite this version:

Daniel Raucoules, Bernard Bourgine, Marcello de Michele, Gonéri Le Cozannet, Luc Closset, et al.. Validation and intercomparison of Persistent Scatterers interferometry: PSIC4 project results. Journal of Applied Geophysics, 2009, 68 (3), pp.335-347. 10.1016/j.jappgeo.2009.02.003 . hal-00510374

HAL Id: hal-00510374 https://brgm.hal.science/hal-00510374

Submitted on 18 Aug2010

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

1	Validation and Intercomparison of Persistent Scatterers Interferometry:
2	PSIC4 project results.
3	
4	
5	Keywords: Persistent Scatterers Interferometry, validation, mining subsidence
6	
7	Authors: Raucoules D. ¹ (corresponding author), Bourgine B. ¹ , de Michele M. ¹ , Le Cozannet G. ¹ ,
8	Closset L. ¹ , Bremmer C. ² , Veldkamp, H. ² , Tragheim D. ³ , Bateson L. ³ , Crosetto M. ⁴ , Agudo
9	M. ⁴ Engdahl M ⁵
10	
11	¹ BRGM (French Geological Survey), 3 avenue C. Guillemin, BP 6009, 45060 Orléans cedex 2,
12	France, <u>d.raucoules@brgm.fr</u> , phone: (33) 2 38 64 30 86; fax : (33) 2 38 64 36 89
13	
14	² TNO - Built Environment and Geosciences (Geological Survey of the Netherlands) Princetonlaan 6,
15	PO Box 80015, 3508 TA Utrecht, The Netherlands
16	
17	³ BGS (British Geological Survey)
18	Kingsley Dunham Centre, Keyworth, Nottingham, NG12 5GG, United Kingdom
19	
20	⁴ IG (Institute of Geomatics)
21	
22	Parc Mediterrani de la Tecnologia, Avinguda del Canal Olímpic, s/n, E-08860 Castelldefels,
23	(Barcelona), Spain
24	
25	⁵ ESA/ESRIN (European Space Agency)
26	Via Galileo Galilei, Casella Postale 64, 00044 Frascati, Italy
27	

1. Abstract:

- 30
- 31

32 This article presents the main results of the Persistent Scatterer Interferometry Codes Cross 33 Comparison and Certification for long term differential interferometry (PSIC4) project. The project 34 was based on the validation of the PSI (Persistent Scatterer Interferometry) data with respect to 35 levelling data on a subsiding mining area near Gardanne, in the South of France. Eight PSI participant 36 teams processed the SAR data without any a priori information, as a blind test. Intercomparison of 37 the different teams' results was then carried out in order to assess any similarities and discrepancies. 38 The subsidence velocity intercomparison results obtained from the PSI data showed a standard 39 deviation between 0.6 and 1.9 mm/yr between the teams. The velocity validation against rates 40 measured on the ground showed a standard deviation between 5 and 7 mm/yr. A comparison of the 41 PSI time series and levelling time series shows that if the displacement is larger than about 2 cm in 42 between two consecutive SAR-images, PS-InSAR starts to seriously deviate from the levelling time 43 series. Non-linear deformation rates up to several cm/yr appear to be the main reason for these reduced 44 performances, as no prior information was used to adjust the processing parameters. Under such 45 testing conditions and without good ground-truth information, the phase-unwrapping errors for this 46 type of work are a major issue. This point illustrates the importance of having ground truth 47 information and a strong interaction with the end-user of the data, in order to properly understand the 48 type and speed of the deformation that is to be measured, and thus determine the applicability of the 49 technique.

50 51

53

54 Repeat spaceborne Interferometry is a well known technique to assess the displacement of the ground 55 surface. It measures the displacement in the sensor's Line-Of-Sight direction from the phase of the

⁵² **2. Introduction**

signal measured by Synthetic Aperture Radar (SAR) onboard a satellite (Goldstein et al., 1988,
Massonnet and Rabaute, 1993).

58 In order to understand the limitations of the technique and to separate the different components 59 (deformation, height, atmosphere) of the interferometric signal, a group of methods named Persistent Scatterers Interferometry (PSI) was developed in the late 1990's (the PSInSARTM algorithm, Ferretti et 60 61 al., 2001). The method aims to extract the information from radar interferometry on a large set of 62 images by taking advantage of the large data archive acquired over the last decade (mainly with the 63 ERS satellites, Envisat and RadarSat satellites). The main idea behind the method is that some bright 64 radar targets retain their phase and amplitude stability for a period of months or years. The phase 65 information of these targets (here denoted Persistent Scatterers or PS) can be exploited to interpret 66 otherwise uncorrelated long time-scale interferograms. Other alternative methods, which use a quality 67 indicator based on the temporal coherence on sub-sampled SAR data are restricted to small baseline 68 pairs (Small BASelines subset technique, Bernardino et al., 2002) or to points showing both a spatial 69 and temporal coherence (Coherent Target Monitoring, Van der Kooij, 2005). In all the cases, the 70 objective is to statistically separate the different components of the interferometric phase of points, 71 where the phase is reliable for the whole data set, to provide a precise assessment of the ground 72 surface deformation.

73 End-users outside the radar community have little experience in utilizing the products delivered with 74 PSI methods. Thus, some concerns about PS data quality, trustworthiness and how to interpret them 75 arose. This issue was clearly identified during the 2003 FRINGE Workshop 76 (http://earth.esa.int/fringe03/Fringe reco3.pdf). ESA (European Space Agency) which decided to 77 initiate this validation project, named PSIC4 (Persistent Scatterer Interferometry Codes Cross 78 Comparison and Certification for long term differential interferometry), in order to assess the 79 performances of PSI for land deformation monitoring.

Eight PSI teams, from business or academic organizations, participated in the project: Altamira
Information (Crosetto et al., 2008), DLR (German Space Agency, Adam et al., 2003), Gamma-RS
(Werner et al., 2003), IREA-CNR (Institute for Electromagnetic Sensing of the Environment National
Research Council of Italy, Berardino et al., 2002), TRE (TeleRilevamento Europa, Ferretti et al.,

84 2007), TUDelft (Delft University of Technology, Kampes, 2005), UPC (Catalonia Polytechnics 85 University, Mora et al, 2003), and Vexcel (Van der Kooij et al., 2005). 107 ERS and 10 Envisat ASAR 86 images were delivered to each of the teams by ESA for them to produce their own PSI deformation 87 products. Their results were then analysed by an independent validation consortium (BRGM, BGS, 88 TNO, IG) as an anonymous procedure so the validation consortium received the data without any 89 identification, except for a random number assigned to each one of the teams.

90 Past validation tests (e.g. Ferretti et al. 2007) were based on controlled displacements of corner 91 reflector points perfectly identifiable as a PS on the SAR data set, which proved the indisputable 92 precision (better than the millimetre) of the technique in ideal conditions. In contrast, this test aimed to 93 address issues more oriented towards the end-user who plans to use PSI products for helping in the 94 management of deformation hazards in a real operational situation. In particular, there is no a priori 95 coincidence between the ground measurement points and the PS. A similar context is presented in 96 Casu et al. 2006. The issue is addressed in section 4.1 based on the spatial characteristics of the 97 deformation field.

98 This current work aims to give an insight on the information that the end user can expect from PSI.99 For this purpose, the project has to address some of the following key questions:

100 - How well does PSI describe the land deformation field, spatially and temporally?

101 - How accurately, and how precisely, does PSI describe the land deformation field?

102 - How consistent are the PSI results between the different teams?

103

These questions are addressed by the validation and intercomparison activities, where the results of each team are compared both against reference ground-based data and against each other in a series of tests designed to give an extended view of the performance of the PSI methods.

107

108 This paper describes the work performed during PSIC4 activities. In this project, six of the eight PSI 109 teams used different implementations of the Persistent Scatterers technique, while the other two teams 110 used alternative concepts (basically two coherent-based approaches). In this paper, the eight PSI teams

112	information about the type and location of deformation in the chosen test area. In addition to this
113	paper, an extensive description of the project is available in the PSIC4 final report (Raucoules et al.,
114	2007).
115	
116	3. Test site
117	
118	The test area was selected by ESA from several proposed by the validation group, who considered not
119	only the characteristics of the deformation (size, rate) but most importantly, the availability and quality
120	of levelling data for the 1992-2004 period.
121	The area of interest is located near the town of Gardanne (Bouches-du-Rhone, France) in the
122	sedimentary basin of "l'Arc" between the Sainte-Victoire Mountain and the cities of Marseille and
123	Aix-en –Provence (figure 1). The area of Marseille-Aix is the second biggest urbanized area in France
124	(with more than 1.4M inhabitants).
125	
126	[insert figure 1]
127	
128	Figure 1: Gardanne mining area. The location of the exploited panels is shown.
129	
130	
131	
132	
133	
134	The coal field (lignite) here has been mined since the Middle Ages Exploitation stopped in February
135	2003. Different mining techniques were used in the area. For the period of interest (1991-2004), the
136	observed ground subsidence is associated with the coal mining exploitation using long wall mining
137	technique at nearly 1000 m below the surface (figure 2). This technique has particular consequences in
138	terms of size (the width of a panel is 250m) and evolution (almost immediate) of the deformation

were asked to process the SAR data according to their own PSI methodology without any a priori

139	compared to older mining techniques. The older methods include chamber and pillar extraction with
140	localised subsidence occurring over a longer time-scale.
141	Typically, when a long-wall panel is mined, half of the displacement (hundreds of metres wide) is
142	produced in the first 2 months with the residual deformation occurring over the following 3 years
143	(Arcamone, 1980). A point on the surface may be influenced by several mined panels extracted at
144	different periods causing the deformation to last for longer periods.
145	
146	
147	
148	
149	
150	[insert figure 2]
151	
152	Figure 2: Detailed plan of the underground mine panels. Isolines indicate the depth of the exploitation
153	panel.
153 154	panel.
153 154 155	panel.
153 154 155 156	panel.
153 154 155 156 157	panel.
153 154 155 156 157 158	panel.
153 154 155 156 157 158 159	panel.
 153 154 155 156 157 158 159 160 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanne
 153 154 155 156 157 158 159 160 161 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanne area was performed through spirit levelling surveys by the French coal mining authority (CDF –
 153 154 155 156 157 158 159 160 161 162 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanne area was performed through spirit levelling surveys by the French coal mining authority (CDF – <i>Charbonnages de France</i>).
 153 154 155 156 157 158 159 160 161 162 163 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanne area was performed through spirit levelling surveys by the French coal mining authority (CDF – <i>Charbonnages de France</i>). The <i>in situ</i> data of the Gardanne test site have been acquired at more than 1000 points over the past
 153 154 155 156 157 158 159 160 161 162 163 164 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanne area was performed through spirit levelling surveys by the French coal mining authority (CDF – <i>Charbonnages de France</i>). The <i>in situ</i> data of the Gardanne test site have been acquired at more than 1000 points over the past decades in order to monitor the deformation effects on the surface associated with the coal mining.
 153 154 155 156 157 158 159 160 161 162 163 164 165 	panel. The monitoring of land deformation effects associated with coal mining exploitation of the Gardanner area was performed through spirit levelling surveys by the French coal mining authority (CDF – <i>Charbonnages de France</i>). The <i>in situ</i> data of the Gardanne test site have been acquired at more than 1000 points over the past decades in order to monitor the deformation effects on the surface associated with the coal mining.

167	[insert figure 3]
168	
169	Figure 3: Gardanne mining area, levelling network . This map shows the names and locations of the
170	levelling lines and the positions of the mining works (in gray).
171	
172	
173	Since 1990, levelling surveys have been carried out with an automatic electronic level (Leica Wild
174	NA3003) whose bar code specified precision performances (Dommanget J.M., 2004) are:
175	
176	Standard deviation of height measure error, measured point-to-point = ± 0.7 mm
177	Standard deviation of height error on a 1 km one-way levelling = ± 1.5 mm
178	
179	4. Pre-processing
180	
181 182	4.1 Previous corrections of the data
183	Although we tried hard to not modify the PSI data (in order not to add involuntary biases to the test),
184	we observed two main problems with the data needing modifications: shifts in the geolocation and
185	biases on the estimated velocities.
186	The only way to carry out the data comparison was to adjust those shifts to make the data comparible.
187	We observed geocoding shifts by overlaying the PSI data on an ortho-rectified (in the local Lambert
188	III Sud cartographic projection) aerial photograph. The geocoding discrepancies ranged between 5m
189	and 80m depending on the team. After correction, the residual geocoding shifts estimated on other
190	control points were between 3m and 23m. It is important to note that these residual errors include the
191	error made in the identification of the radar features on the ground. A linearly varying shift would
192	probably have provided a better final geolocation. However, we assumed that the constant shift we
193	applied to the data was sufficient for the purpose of this study.

More generally, we emphasize the fact that for many applications where the deformation is of very small extent (e.g. shrink-swelling, cavity collapses, small landslides etc.), the geocoding issue is very important for a potential end-user. It is essential to produce data that can be overlaid with sufficient accuracy on reference maps to allow a correct interpretation. During the processing an interaction with the end-user is recommended.

199 The fact that the different teams did not chose the same reference point for deformation computation 200 produced biases on the assessment of the deformation, making direct comparison impossible. We 201 carried out a stable area adjustment based on the levelling information and the knowledge of the end-202 user (CDF) and chose the stable area outside the influence of the mining works. The objective is to be 203 sure that all the PSI datasets are referenced against the same stable area as the levelling network in 204 order to have comparable data. In a general case, the choice of a reference stable area can be critical 205 for the measurement. In operational use we think that the reference should be selected in agreement 206 with the end-user in order to better respond to his needs.

207 Once we selected the stable area (figure 4), we calculated the average deformation rate value for those 208 PS included in the stable area and for all the teams. In this area, where the velocity should be zero and 209 the time series should be flat, PS average velocity and time series highlighted either a subsidence or an 210 uplift. We assume that the non-zero velocity values can be considered as a bias on the velocities 211 affecting the whole dataset due to bad reference choices. We therefore used the computed average 212 deformation rate values to force both the PS average velocities to be zero and time series to be flat 213 within the stable area. In practice, we first corrected the average velocity estimations on the whole 214 PSI dataset by subtracting the calculated stable area values from the dataset. Secondly, we corrected 215 the time series by removing a linear trend derived from the previous velocity correction estimation.

216

- 217
- 218

[insert Figure 4]

Figure 4: The selected stable area (white frame) is located around the five stable levelling points identified by their codes. The triangles correspond to the levelling points, circles to PS provided by the team T4.

223

4.1 Interpolation of the data

225

The major issue for the comparison between levelling data and the PSI results comes from the fact that the spatial and temporal sampling of the PS-field and Time Series and the levelling lines do not coincide. The levelling frequency is about twice a year whereas the PSI data correspond to the sensor acquisition rate which is on average every 40 days (taking into account a gap in the acquisitions during 1994). The number of levelling points are fewer than the number of PSI points. The objective of interpolation is to define which value derived from the SAR data can be compared with a given value derived from the levelling.

The option we applied in this study was the following. We interpolated temporally the levelling data to the SAR acquisition dates and we interpolated spatially the PSI deformation values to the levelling point positions (using a limited radius of 50m around the levelling points).

The basic justification is that the studied phenomena have sufficient spatial extents to justify a spatial interpolation in a 50m radius. In fact, in this area, the subsidence bowls due to the mining works spread over hundreds of metres (Arcamone, 1980).

Now, with the selected procedure, each levelling point with given geographic coordinates can be associated to the deformation Time Series corresponding to the eight participant teams and to the levelling measures.

Our choice for the temporal interpolation of the levelling instead of the SAR data was decided in order to avoid excessive smoothing of the time series. Smoothing could hamper the assessment of the quality of the PSI time series. An additional reason is that, due to the nature of the levelling dataset, which is the compilation of 17 lines measured independently at different dates and frequencies, we were not able to define a unique temporal sampling for the levelling.

All the Time Series (SAR and interpolated levelling) were set to '0 deformation' using 15/07/1992 asthe reference date. This date corresponds to the oldest image used by all the teams.

249	We interpolated the levelling by ordinary kriging. This allowed us to retrieve an interpolation error.
250	So, for the PSIC4 exercise, we kept only the values with an interpolation error lower than 3.5mm.
251	For the spatial interpolation, because the PSI results were massively oversampled with respect to
252	levelling, a spatial kriging computation was performed for each image with a 50 metres search
253	neighbourhood in order to reject possible variability on longer distances.
254	
255	
256	5. Intercomparison
257	
258	The intercomparison activities aimed to identify relative differences between the teams. The initial
259	objective of the exercise was to check if the different methods provided equivalent results and to
260	assess any discrepancies. Among the tested indicators, the most relevant are: 1) the average
261	deformation rate; 2) the density and distribution of the PS.
262	
263	1) Average deformation rates.
264	
265	To estimate the discrepancies between the teams' results in terms of velocity maps, we resampled the
266	data included in a common area to a 50m by 50m grid containing the velocities of each of the teams.
267	Using the ISATIS TM software, we carried out a comparison by pairs of teams: for each pair of
268	produced PSI sets, we assessed the mean of the differences, the correlation value and the standard
269	deviation of the differences on the cell occupied by the two compared teams.
270	The main indicator is the standard deviation that reflects the discrepancies between teams. It ranges
271	from 0.6 mm/yr to 1.86 mm/yr.
272	The mean of the differences can show possible biases, although these values have been partially
273	affected by the stable area correction and are therefore less relevant as a performance indicator. These
274	values range from -0.84 mm/yr to +0.44 mm/yr. The following table shows the full set of velocity
275	intercomparison values.
276	

Team	T1	T2	T3	T4	T5	T6	T7	T8
	(889pts)	(5100pts)	(4169pts)	(6552pts)	(2511pts)	(1269pts)	(6360pts)	(17081pts)
T1		1.57 (0.79)	0.85 (0.85)	0.88 (0.85)	1.23 (0.83)	0.84 (0.72)	0.96 (0.83)	1.44 (0.85)
ТЭ	0.26	(11)	0.87 (0.80)	1.06 (0.95)	1 10 (0 86)	0.00 (0.71)	1 01 (0 95)	1 86 (0 72)
12	-0.20		0.07 (0.09)	1.00 (0.05)	1.19 (0.00)	0.99 (0.71)	1.01 (0.05)	1.00 (0.73)
Т3	-0.14	0.12		0.63 (0.94)	0.87 (0.91)	0.73 (0.83)	0.71 (0.90)	1.40 (0.72)
T4	-0.46	-0.13	-0.24		1.01 (0.89)	0.74 (0.81)	0.76 (0.89)	1.46 (0.72)
Т5	0.11	0.27	0.20	0.44		1.08 (0.71)	0.99 (0.87)	1.71 (0.73)
Т6	-0.34	0.06	-0.05	0.20	-0.21		0.81 (0.77)	1.06 (0.64)
Т7	-0.32	0.02	-0.1	0.14	-0.32	-0.10		1.33 (0.72)
Т8	-0.82	-0.41	-0.56	-0.25	-0.84	-0.47	-0.40	

279

Table 1: intercomparison of velocities. The upper right triangle contains for the teams corresponding to the rows and columns, the standard deviation of the velocity differences and the correlation (in parenthesis). The lower triangle contains the mean of the velocity differences. The number of cells occupied by each team is indicated in the first raw of the table.

284

285

286

2) Density and spatial distribution of the PS

287 PS distributions how large variations. For example, some teams have no PS selected in the

deformation area whereas team T8 seems to have a larger density in those areas. Such differences are

probably the consequence of the use of different coherence thresholds on the selection of the points.

290	The figures 5 and 6 show the two extreme cases observed: team T6 rejected practically all the points
291	of the deformed area and team T8 kept a large density of points.
292	[insert figure 5]
293	Figure 5: density of PS for Team 6. The location of the main deformation (derived from
294	conventional interferometry) is showed (blue contour).
295	[insert figure 6]
296	
297	Figure 6: density of PS for Team 8. the location of the main deformation (derived from conventional
298	interferometry) is showed (blue contour).
299	
300	6. Validation results
301	
302	The validation in this study is the comparison of the interpolated PSI data with the corresponding
303	levelling measurement.
304	The first test is a semi-quantative comparison. We selected the more representative levelling line
305	("AXE" - located on figure 3 - it crosses the main deformed area) and visually compared the PSI data
306	versus the levelling data along it. Figure 7 shows the spatial variation of the cumulative deformation
307	within the period from 1992 to 1998 for each of the teams.
308	Most of the teams (except team T6) spatially localised the deformation. We observed dissimilarities
309	with the levelling and between PSI teams. In particular, the PSI results seem to underestimate the
310	higher deformations.
311	
312	
313	[insert figure 7]
314	

315	Figure 7a): cumulative deformation between 06/05/1992 and 31/10/1998 along the "AXE" levelling
316	seen by the different PS Teams and the levelling versus distance to first point. The frame corresponds
317	to section magnified in figure 7b). We can observe important discrepancies in the area of higher
318	deformation.
319	Figure 7b): Zoom of the profiles along "AXE" line in a section with moderate (less than 3cm)
320	deformation. This gives a first insight on the relative variability between the different teams. The PSI
321	results globally follow the levelling profile but with fluctuations (respect to levelling and other teams)
322	of about 10-15 mm; a more precise estimation is given below.
323	
324	

The RMSE (root mean square error) of the PSI time series against the levelling time series are reported in table 2. The values are represented by average velocity classes (estimated on levelling). We can observe a dependence of the RMSE with respect to the velocity value (figure 8). The values range on average from 1.5 cm for the lower velocity class (less than 5 mm/yr) to 10 cm (for the larger movements (more than 15 mm/yr).

- 331
- 332

	velocity								
	(mm/yr)	1	2	3	4	5	6	7	8
	>0	12	10	9	11	14	14	9	20
	[0; -5]	18	14	14	18	14	22	9	22
]-5;-10]	38	41	38	46	32	58	25	27
]-10; -								
	15]	108	97	90	85	86	86	75	69
	<-15	93	97	151	112	106	85	99	91
333									
334		Table 2.	Average l	RMSE (mm) per veloci	ty class and	per proces	ssing chain	
335									
336									
337									
338									
339			[insert figure	8]				
340	Figure 8: RMSE per velocity class and per processing chain								
341									
342	A last indi	cator cons	sists of con	mparing the	estimation	of the vel	ocity obta	ined by P	SI versus the
343	levelling. 7	The follow	ving figure	es show the	e velocity	values deri	ved by li	near regre	ssion on the
344	deformatior	deformation time series, from both the levelling and the PSI on the location of the levelling points.							

	Team	Number of points	Mean of	Standard	deviation
368					
367					
366					
365					
364	6 mm/yr.				
363	(characteristics of deform	ation and land-use) the	standard deviation of the	elocity differe	ences is about
362	Table 3 gives a quantita	tive assessment of the	discrepancies. In the co	nditions of th	e experiment
361					
360	Figure 11. Vertical veloci	ties derived from PSI re	sampled at levelling point	s location. Tea	ams T5-T8.
359		[insert fi	gure [1]		
358					
357					
356	Figure 10. Vertical veloci	ties derived from PSI re	sampled at levelling point	s location. Tea	ams T1-T4.
355	[i	nsert figure 10]			
354					
353					
352					
351					
350	Figure 9: Vertical velociti	es estimated from level	ling data resampled at SA	R acquisition of	lates
349	[i	nsert figure 9]			
348					
347					
346	with the previous observa	tions).			
345	This allows a visual exan	nination of the discrepa	ncies in the area of major	deformation	(in agreement

		(Ti – Levelling)	of
			(Ti – Levelling)
T1	158	2.8	5.3
T2	478	4.4	7.2
Т3	328	3.9	6.6
T4	447	3.7	6.3
T5	348	3.6	6.8
T6	136	3.2	5.1
T7	417	2.6	5.7
T8	817	4.7	6.7

369 Table 3: Overall differences between PS and levelling velocities (in mm/yr): mean and standard
370 deviation of difference between PSI and levelling.

371

To complete this comparison we have to highlight that the number of points associated with levelling is very variable between the teams (158 to 817 in the same area). For instance, team T8 produced points on most of the levelling line lengths. Therefore, the discrepancy with levelling is more affected by the effect of the underestimation of the higher deformations. The quantitative comparison is then less favourable to those who provided points in the higher deformation area, but they provided a better qualitative description of the deformation.

- 378
- 379
- 380 7. Discussion
- 381
- 382

• The PSIC4 exercise was conceived as an inter-comparison and validation of PSI data computed by eight different teams. The aim of this exercise was to evaluate the performance of eight different PSI methodologies by comparing the results with ground based observations and by inter-comparing the results from the eight processing chains. The results of this study provide an assessment of the absolute (validation) and relative (inter-comparison) performance of the PSI techniques. The PSIC4 exercise is a blind test, carried out on a mining site characterised by different magnitudes and evolutions of deformation and variable land cover. It is worth emphasising that the PSIC4 project represents a unique experiment for the number of PSI teams involved and for the quality of the available ground truth, which involve more than 1000 levelling benchmarks measured once or twice per year.

However, it is important to underline that the deformations of the PSIC4 test site, especially those of the mining area of Gardanne, where the majority of the ground truth are located, represent a difficult case for the PSI techniques. In fact, the deformations range from a few centimetres up to some decimetres, and most of the deformation occurs in a few months, a rather short period for the (at most) monthly SAR acquisitions.

Therefore, in PSIC4 the performances of PSI techniques were tested at the very edge of their capability, as the PS interferometry processing is performed in the less favourable conditions and is evaluated upon the strongest criteria.

401

When going through the results of the PSIC4 exercise, one should keep in mind the following issues inorder to properly interpret the outcome of the study:

404

405 1. The eight teams had no knowledge of the type of deformation occurring on the test site, i.e. 406 information such as the linearity/non-linearity of the deformation, the driving mechanism, the location 407 of the deformation, when it started and when it ended, and the expected deformation magnitude. In 408 general, the teams received no information about the deformation signal of interest and, the goal of the 409 PSI analysis was not clearly specified. In contrast, the validation was focused on a specific 410 deformation phenomenon, i.e. the deformation associated with the mining area of Gardanne. This 411 point is important because PSI data processing has different parameters that can be adjusted for a 412 specific application goal. For instance, the processing can be modified to take into account a priori 413 knowledge of fast displacements.

2. The PS measurements were evaluated against the strongest criteria. For the first time the validation
of PSI against levelling data was performed quantitatively to the millimetre level. Some of these
criteria can be non relevant in specific applications.

418

419 The results show that the PS technique is not invalidated, but the outcomes of the PSIC4 project 420 should be used to improve PS interferometry performances for the critical application cases.

421

• The main indicators investigated during the project were the following:

423

424 *Time Series validations.* A comparison of the spatio-temporal profiles of the levelling data and PSI 425 data along two levelling transects show that, for this case, the stretch along the line experiencing most 426 subsidence was not well sampled by seven out of eight teams and an underestimation of subsidence 427 velocity was shown by all teams.

428 A comparison of the PSI time series and levelling time series shows that if the displacement is larger 429 than about 2 cm in between two consecutive SAR-images, PS-InSAR starts to seriously deviate from 430 the levelling time series. Since, for the Gardanne site, a large number of the levelling time series show 431 large displacements for two consecutive SAR-acquisition dates (35% in excess of 2.8 cm and 70% in 432 excess of 1.4 cm) validation results are therefore negatively biased. This also explains the low number 433 of cases for which PS-InSAR time series and levelling time series could be tested to belong to the 434 same population. If one only compares those time series having a maximum displacement of 1.4 cm or 435 less for two consecutive SAR-acquisition dates, then the current study shows average RMSE between 436 levelling time series and PSI time series of 7 mm to 25 mm. One has to compare this with validation 437 studies performed on artificial scatterers which show standard errors of the time series of 2 mm. From 438 this it can be concluded that for those locations for which phase unwrapping ambiguities do not exist, 439 at least some of the processing chains obtain results in line with previous studies, which mainly took 440 place under controlled circumstances. In all cases reviewed, the team's results did underestimate the 441 subsidence rate in areas showing moderate to fast subsidence. The main reason suggested for this is 442 the character of the subsidence process in the study area. As a result of mining activities in this area, 443 the subsidence takes place over a relatively short time-span. The strong correlation between RMSE 444 and magnitude of displacement for two consecutive SAR-acquisition dates, suggests that the results 445 have certainly been affected by phase unwrapping ambiguities, leading to a systematic 446 underestimation of the subsidence rates.

447

448 *Velocity validation.* The comparison of the PS-InSAR velocity with the ones derived from levelling 449 shows an average absolute difference with standard deviations between 5 and 7 mm/yr. Again, the 450 standard deviations are strongly dependent on the absolute value of the actual displacement of the 451 measured point. It can reach more than 15 mm/yr on the main deformed area but generally less than 2 452 mm/yr on stable levelling points.

453

454 Spatial distribution intercomparison. The highest densities related to urban areas, where many 455 scattering objects exist. Surprisingly, some teams were able to find points in areas of forest or 456 agriculture (Team T8 in particular). Some teams (such as Teams T1 and T8) did succeed in finding PS 457 within a rapid ground motion zone in urban areas. Other teams were not able to identify as many 458 points in these areas. The PSIC4 exercise shows that for the case under consideration, the main area of 459 subsidence could not, or could only partly, be assessed and identified by seven out of eight teams. The 460 main reason for this has been the low density of Persistent Scatterers in the area of interest thus 461 masking the actual subsidence bowl. Nonetheless, improvements are possible taking into account that 462 one team did find a high distribution of Persistent Scatterers within the subsidence area.

463

Velocity intercomparison. Velocity is the basic deformation parameter derived from PSI techniques, as
it is obtained by assessing a linear regression on the phase history. A very high precision was therefore
expected. However, the inter-comparison results show discrepancies, in terms of standard deviation,
between 0.6 to 1.9 mm/yr.

468

Geocoding comparison. Significant differences occur between teams, with magnitudes of 'average
geocoding difference' between 6 and 80 metres before correction. Improvements can be considered
and a better use of prior cartographic information (such as high resolution ortho-photos) might help.

472

To conclude this discussion, we will present some key outcomes resulting from the responses of theparticipant teams to open questions addressed after the analysis of the PSI products.

475

1) One of the most important conclusions of the project concerns the characteristics of the mining test site of PSIC4, which include abrupt nonlinear movements with magnitudes that range from a few centimetres up to some decimetres. These are severe characteristics from the viewpoint of C-band PSI with the temporal acquisition capabilities of ERS and Envisat. Why are the deformation characteristics so important? Because in principle, PSI can measure surface displacements with millimetric precision, but this can only be achieved under the following conditions:

482 • The right model to describe the deformation is adopted. This is difficult to accomplish with
483 abrupt nonlinear movements.

- The aliasing due to low PS density and/or low temporal sampling with respect to deformation,
 which may cause phase unwrapping errors, is controlled. This is difficult or impossible with
 strong deformation magnitudes.
- 487 The assumptions to separate the atmospheric contribution from deformation are correct. This
 488 typically fails in presence of nonlinear motion.

489 Most of the results of PSIC4 can be understood in the context of the above conditions: none of them is490 fully accomplished in the mining area of Gardanne in the context of this study.

2) It is worth underlining that the above consideration of "strong deformations" holds for C-band PSI
with the current temporal acquisition capabilities of ERS and Envisat. They cannot in principle be
extended to other types of SAR missions based on different bands and more frequent SAR acquisition
capabilities.

495 3) The PSIC4 project was conceived in a specific framework, where the teams worked under "blind 496 conditions", with no a priori information on deformation type, driving mechanism, deformation 497 magnitude, etc. Furthermore, they had no information about the exact deformation signal of interest, 498 i.e. the goal of the PSI analysis. By contrast, the validation was focused on a specific deformation 499 phenomenon, *i.e.* the deformation associated with the mining area of Gardanne. This point is important 500 because it played a key role in the PSI processing. In fact, instead of tailoring the processing to a 501 specific objective of the analysis, the teams used a standard approach and processing which is feasible 502 with reasonable resources. It is worth emphasising that the area covered by most of the teams is considerably larger than the 100 km² area used for the validation. None of the PSI teams has 503 504 performed an advanced or refined PSI analysis, because neither the area of interest nor the goal of the 505 refinement was defined. This again explains most of the PSIC4 results, e.g. the lack of PS in the 506 mining area "of interest".

507 4) It is worth analysing a specific consequence of the above point, which explains the different 508 densities achieved by the teams. The PS densities are different because there is no "definition" of what 509 exactly is a PS. The teams used their standard PSI approach (instead of an advanced or tailored one) 510 and delivered the PS only where both velocity and time series could be extracted with reasonable 511 reliability. Unfortunately the validation area represents a difficult area, where phase unwrapping errors 512 represent the main problem. Due to the high probability of this type of error, many teams did not 513 deliver reliable information. Note that this did not occur outside the mining area, i.e. in the great 514 majority of the covered areas, see point six.

5) Considering the above points and the results achieved in the Gardanne mining area we can say that 516 PSIC4 has clearly demonstrated that the PSI limitations are real, i.e. that PSI is not applicable 517 everywhere. Though this was already clear to many PSI specialists, this evidence has now been widely 518 documented.

519 6) To conclude, the limitations of PSI over deformation areas with similar characteristics to Gardanne
520 open a series of important issues for the future. The first one is the importance of a feasibility study
521 before running a PSI analysis. This may help in avoiding false expectations and disappointing results.

A second issue concerns the appropriate ways to inform the PSI users of the limitations of the technique, especially in those cases where PSI is employed under the non-ideal conditions. Then it is interesting to investigate the possibility of using alternative techniques to PSI, like DInSAR which could provide useful information in difficult applications like mining areas.

526

527 **8. Acknowledgement**

528

529 This study was carried out in the frame of the PSIC-4 project funded by the European Space Agency.

530 The authors wish to thank Charbonnages de France for their help in this project.

531 For D. Tragheim and L. Bateson, this paper is published with permission of the Executive Director,

532 British Geological Survey.

5	3	Δ
\mathcal{I}	\mathcal{I}	Τ.

535	ADAM N., KAMPES, B. M., EINEDER, M., WORAWATTANAMATEEKUL, J. and KIRCHER,
536	M., 2003, The development of a scientific permanent scatterer system, Proceedings of ISPRS
537	Workshop on High Resolution Mapping from Space, Hannover, Germany
538	
539	ARCAMONE, J., 1980, Méthodologie d'etude des affaissements miniers en exploitation totale et
540	partielle – application au cas des houillères de Provence, PhD thesis, Institut National Polytechnique
541	de Lorraine, France.
542	
543	BERARDINO, P., FORNARO, G., LANARI R. and SANSOSTI E., 2002, A new algorithm for
544	surface deformation monitoring based on small baseline differential SAR interferograms, IEEE
545	Transactions on Geoscience and Remote Sensing, 40, 2375-2383
546	
547	CASU, F.,,, MANZO, M. and LANARI, R., 2006, A quantitative assessment of the SBAS algorithm
548	performance for surface deformation retrieval from DInSAR data, Remote Sensing of Environment, 1,
549	20-28
550 551	CROSETTO M., BIESCAS E. and DURO J., 2008, Generation of advanced ERS and Envisat
552	interferometric SAR products using the stable point network technique, Photogrammetric Engineering
553 554	And Remote Sensing, 4, 443-450
555	DOMMANGET I.M. 2004. Gardanne layelling data specifications, personnal communication
556	Downwi arton in 2004, Gardanne lavening data specifications, personnal communication
557	FERRETTI A PRATI C and ROCCA F 2001 Permanent scatterers in SAR interferometry IEEE
558	Transactions on Geoscience and Remote Sensing 39 8-20
559	Transactions on Geoscience and Remote Sensing, 57, 6-20
557	

 560 561 562 563 564 565 566 	 FERRETTI, A., SAVIO, G., BARZAGHI, R., BORGHI, A., MUSAZZI, S., NOVALI, F., PRATI, C. and ROCCA, F., 2007, Submillimeter accuracy of InSAR time series: Experimental validation, IEEE Transactions on Geoscience and Remote Sensing, 45, 1142-1153 GOLDSTEIN, R., ZEBKER, H. and WERNER, C., 1988, Satellite radar interferometry two- dimensional phase unwrapping, Radio Science, 23, 713-720
567 568 569 570	KAMPES B. M., 2005, Deformation parameter estimation using permanent scatterer interferometry. PhD thesis. Delft University of Technology, Delft
 571 572 573 574 575 	LANARI, R., MORA, O. AND MANUNTA, 2004, A small-baseline approach for investigating deformations on full-resolution differential SAR interferograms. IEEE Transactions on Geoscience and Remote Sensing, 7, 1377-1386
576 577 578 579 580 581	MASSONNET, D. and RABAUTE, T., 1993, Radar interferometry, Limits and potential IEEE Transactions on Geoscience and Remote Sensing, 31, 455-464. MORA O., MALLORQUI J.J. and BROQUETAS A., 2003, Linear and nonlinear terrain deformation maps from a reduced set of interferometric SAR images, IEEE Transactions On Geoscience And
582 583 584 585 586	Remote Sensing, 10, 2243-2253 RAUCOULES, D., BOURGINE, B., DE MICHELE, M., LE COZANET, G., CLOSSET, L., BREMMER, C., VELDKAMP, H., TRAGHEIM, D., BATESON, L., CROSETTO, M., AGUDO, M., and ENGDAHL, M., 2007, available online at <u>http://earth.esa.int/psic4/PSIC4_D9_final_report.pdf</u> (accessed August 2007)
500	(accosca August 2007).

- 589 VAN DER KOOIJ, M., HUGHES, W., SATO, S. and V. PONCOS, 2005, Coherent Target
- 590 Monitoring at High Spatial Density, Examples of Validation Results, Fringe 2005, ESA, Frascati,
- 591 Italy, November 28 December 2, 2005
- 592
- 593 WERNER, C., WEGMULLER, U., STROZZI, T., AND WIESMANN, A. 2003, "Interferometric
- 594 point target analysis for deformation mapping", Proceedings of IGARSS'03, vol. 7, pp. 4362-4364,

595



























