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A stacking method and its applications to Lanzarote tide gauge records

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Abstract

A time-period analysis tool based on stacking is introduced in this paper. The original idea comes from the classical tidal analysis method. It is assumed that the period of each major tidal component is precisely determined based on the astronomical constants and it is unchangeable with time at a given point in the Earth. We sum the tidal records at a fixed tidal component center period T then take the mean of it. The stacking could significantly increase the signal-to-noise ratio (SNR) if a certain number of stacking circles is reached. The stacking results were fitted using a sinusoidal function, the amplitude and phase of the fitting curve is computed by the least squares methods. The advantage of the method is that: (1) An individual periodical signal could be isolated by stacking; (2) One can construct a linear Stacking-Spectrum (SSP) by changing the stacking period Ts; (3) The time-period distribution of the singularity component could be approximated by a sliding-stacking approach. The shortcoming of the method is that in order to isolate a low energy frequency or separate the nearby frequencies, we need a long enough series with high sampling rate. The method was tested with a numeric series and

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then it was applied to 1788 days Lanzarote tide gauge records as an example.

Key words: Stacking period, Singularity, Tides

1 1 Introduction

One of the most interesting fields for geophysical studies is to extract the dif-2 ferent periodical signals from the observations [Van Ruymbeke et al. (2007); 3 Guo et al. (2004)]. There are many choices to meet this requirement taking 4 the advantage of the rapidly developed mathematical methods accompanied 5 with high speed computers. Among them, the most intensively used method is the Discrete Fourier Transform (DFT). In order to locate certain periodical 7 signals, there exists some similar ways such as Prony Analysis [Hauer et al. 8 (1990)], Phase-Walkout method [Zürn and Rydelek (1994)] and the Folding-9 Averaging Algorithm [Guo et al. (2007, 2004)]. The stacking tool proposed 10 here could be explained as a simplified procedure the afore-mentioned proce-11 dures because it assumed that the signal's period T is precisely known. The 12 tool also could be viewed as a special case of Prony Analysis (PA). PA anal-13 yses signal by directly estimating the frequency, damping, and relative phase 14 of modal components present in a given signal [Hauer et al. (1990)]. In our 15 case, the condition is that the signal is mainly consisting of different periodical 16 harmonic components and noise. We study the individual singularity by sum-17 ming the time series at a stacking period Ts $(Ts = T/\Delta t)$, with Δt sampling 18 interval. We average the stacking results and fit it using a sinusoidal function. 19 The amplitudes and phases of fitting curve were computed by the least squares 20

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method. The precision of phases and amplitude determinations are dependent 21 on two factors. One is the way we assign the initial phase of the first stacking. 22 For instance, when we use the stacking procedure to separate tidal waves, the 23 initial phase of selected wave must be calculated from astronomical param-24 eters, otherwise we will lose the physical meaning of the phase. The way to 25 compute the phase of the tidal component could be found in the earth tide the-26 ory textbooks [Melchior (1983)]. The second factor is finding the best stacking 27 period Ts which is not always the integral times of sampling rate. To find the 28 nearest Ts to signal's true period T, sometimes we need to search Ts in several 29 points $(Ts = Ts \pm \delta)$ until the minimum differences between stacking results 30 and fitting curves is reached. Beyond its application to singular component 31 analysis, the stacking function also can be used to analyze a time series at a 32 given period range by a linear Stacking-Spectrum (SSP). Another property of 33 the tool is that when the stacking period and the initial phase were selected, 34 we can model the space and time distribution of one singularity by shifting 35 the stacking windows with a constant step. There are several techniques which 36 could be used in time-frequency analysis, such as Short-Term Fourier Trans-37 form (STFT) and Continuous Wavelets Transform (CWT). Both of them are 38 focused on overcoming the shortage of FFT in which time information is lost. 39 The CWT are more effective than STFT [Daubechies (1992)]. In order to 40 study the time-period localization of one singularity but not a frequency band 41 signals like STFT and CWT, we developed the Sliding-Stacking approach. 42 Since each classical tidal analysis method like Eterna by [Wenzel (1996)], VAV 43 by [Venedikov et al. (1997)], and Baytap-G by [Tamura et al. (1991)] already 44 meets the requirement of separating the tidal component with high accuracy 45 from tidal records [Dierks and Neumeyer (2002)]. The tool proposed here could 46 be summarized as a simplified approach to study periodic signals and estimate 47

the response of any signal to a selected period. For example, the isolated tidal 48 constituent from continuous P wave velocity records, could be severed as ref-49 erences for in-situ seismic velocity monitoring [Yamamura et al. (2003)]. It is 50 also possible to study the correlations between different tidal cycles and seis-51 mic activities by the stacking approach [Cadicheanu et al. (2007)]. Another 52 promising application field is that the tidal waves can be utilized to calibrate 53 some arbitrary records in-situ since the earth tidal model is the most reliable 54 one [Westerhaus and Zürn (2001)]. Recently published works announce that 55 the precision of calculated theoretical tidal potential V over years 1-3000 C.E. 56 reached $\pm 0.1 \text{ mm}$ [Ray and Cartwright (2007)]. 57

58 2 Algorithm of stacking

⁵⁹ The base function of stacking is:

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$$f(t) = \frac{1}{N_S} \sum_{i=1}^{N_S} \sum_{j=1}^{T_S} y(t_j) + \varepsilon$$
(1)

⁶¹ i = 1, 2, 3, ...Ns j = 1, 2, 3, ..., Ts where f(t) represents averaging stacking ⁶² results, t the time, y(t) the observed data. Ts, stacking period $Ts = T/\Delta t$, ⁶³ T the signal's period, Δt sampling interval, Ns the stacking number of times, ⁶⁴ $Ns = \tau/Ts$, τ data length, ε the uncertainties and errors. We use sinusoidal ⁶⁵ function to fit the stacking results f(t)

$$f(t) = \sum_{i=1}^{T_s} (a\cos(\omega i + \phi) + a\sin(\omega i + \phi))$$
(2)

⁶⁷ The standard deviation is given by:

$$\sigma = \sqrt{\frac{1}{Ts} \sum_{i=1}^{Ts} (f(t_i) - \hat{f(t_i)})^2}$$
(3)

So the amplitude a and initial phase ϕ are determined by minimizing σ using the least squares method. For a given Ts, we get one solution (a, ϕ) . If we select a series of stacking periods $(Ts_1, Ts_2, ..., Ts_n)$, we have n solutions $((a_1, \phi_1), (a_2, \phi_2), ..., (a_n, \phi_n))$. Then the linear stacking spectrum (SSP) are constructed by:

$$^{74} \qquad SSP = \begin{pmatrix} T_1 \ a_1 \ \phi_1 \\ T_2 \ a_2 \ \phi_2 \\ \dots \\ T_n \ a_n \ \phi_n \end{pmatrix}$$
(4)

In fact, it is not necessary to stack complete time series by one stacking period Ts. From the numerical experiment, it shows that the Ns depends on the signal-to-noise ratio. For high SNR series, a smaller number of stacking times can reach a certain level of accuracy. If the minimum required stacking times Ns are much shorter than the data length τ , one can use a rectangular window w to separate the data into equal length segments. Then, the amplitude and phase was computed by equation (1) to (3) for each segment.

$$w(n) = 1 \quad n = Ns * Ts \tag{5}$$

⁸³ When the windows are overlapped with each other by a constant length $(c\Delta t, c > 0)$ and moved in one direction, it is possible to approximate the time-⁸⁵ period localization with time resolution $c\Delta t$ by a Sliding-Stacking approach.



Fig. 1. Results obtained from Stacking and DFT with SNR=0.01. The left column shows the original signal, white noise, noise+signal; the middle column shows the amplitude Fourier transforms of left records and the last column shows the stacking results of noise polluted signals. The stacking results (gray), sinusoidal fit (blue) and original signal (red) were plotted together.

⁸⁶ **3** Numerical test

We firstly tested the method with a synthetic series. A time series was con-87 structed by the addition of three periodical signals, $s1(a = 10, T = 2secs, \phi =$ 88 0), $s2(a = 5, T = 3secs, \phi = 0)$, $s3(a = 2, T = 5secs, \phi = 0)$, and white 89 noise ε . The sampling interval (Δt) was 0.01 second. The length of the series 90 were 100,000 points. The Ts is 200 for s1, 300 for s2, and 500 for s3. Dif-91 ferent cases were computed referring to the noise level, Signal-to-Noise Ratio 92 $(SNR = s1_{max}^2 / \varepsilon_{max}^2)$. Eleven series were generated (SNR = 0.1 - 0.5 step by)93 0.1, 1.0-7.0 step by 1.0). We compared the amplitudes computed by the DFT 94 and the Stacking methods. The accuracy of the amplitudes determination was 95 influenced by the noise level. The results showed that when the SNR was low 96 (SNR = 0.1) the DFT gave better amplitude determination for s1 and s3 97 than the stacking. But when the signal-to-noise ratio was high (SNR = 7.0), 98

the stacking results were obviously better than the DFT results (table1). This
is true for all the cases of signal s2 because the period of the frequency of s2
was a repeating decimal which contaminated the precision of the DFT results.

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103

Table 1 amplitude determination $\delta a = (a - a_0)/a_0 \%$						
SNR = 0.1	$a_1 = 10$	δa_1	$a_2 = 5$	δa_2	$a_3 = 2$	δa_3
DFT	9.804	1.96%	6.689	33.78%	2.712	35.60%
Stacking	10.890	8.90%	4.471	10.58%	3.914	95.70%
SNR = 7.0	$a_1 = 10$	δa_1	$a_2 = 5$	δa_2	$a_3 = 2$	δa_3
DFT	9.075	9.25%	7.077	41.54%	2.132	6.60%
Stacking	9.984	1.60%	5.071	1.42%	2.099	4.95%

In general, for all eleven test cases, the accuracy of amplitudes determination 104 less than 10% was 67% for stacking and 33% for DFT. Furthermore, we eval-105 uated the influence of the signal-to-noise ratio and the stacking number of 106 times on the results. It should be tested separately because both parameters 107 will directly influence the final results. To test the influence of Ns, the SNR 108 was assigned as 0.1. To compare the effects of different noise levels, the Ns 109 were set as 120. We separated the singularity (T = 2secs) from the synthetic 110 time series by equation (1) and (2). The standard deviation σ was computed 111 by equation (3). The stacking number of times Ns was increased from 5 until 112 450 increased by steps of 5 with SNR = 0.1. The σ was oscillating around 113 0.5% when the Ns was larger than 60, then the trench became more stable 114 with $\sigma < 0.5\%$ after 120 times stacking (Fig. 2 left). After that, we took the 115 same series, but added different level of noise (SNR from 0.01 to 5 increasing 116 by 0.01 with Ns = 120). The signal (T = 2s) was isolated again by equation 117



Fig. 2. (Left), Plot σ against Ns, the Ns increased from 5 until 450 times increasing by steps of 5. (Right), Plot σ against SNR , 500 noise levels were compared from 0.01 to 5.

(1) and (2) from different level noise contaminated series. The distribution of 118 σ was more scattered (Figure 2 right). In fact, even for the very high noise 119 level (SNR=0.01), the σ was around 0.8% after 120 times stacking. This again 120 confirms the stacking is a efficient way to reduce the random white noise. If 121 the signal-to-noise level is sufficiently high (SNR > 0.1), with small number 122 of stacking times (Ns > 20), we can easily isolate the harmonic components 123 with 1% accuracy (Fig. 2 left). The synthetic test proved again that one can 124 use the stacking approach to study known periodical signals behind a long 125 time series. The tidal records are one of the most suitable cases for such an 126 application due to the periods of main tidal constituents which are precisely 127 determined based on astronomical constants. 128

¹²⁹ 4 Lanzarote tide gauge station

The landscape of Lanzarote is dominated by numerous volcanoes. The observation site named "Jameos del Agua" is located in a lava tunnel of the quaternary volcano "La Corona". The last periods of volcanic activity at Lanzarote were during the 18th and 20th century. The most special eruption took



Fig. 3. The field site of tidal gauge station, the sensor was installed under an open lake inside a lava tunnel . The only connection to the sea is a crack perpendicular to a sand pyramid located 750 meters away which was discovered by a diving survey in 1985.

¹³⁴ place from 1730 to 1736 in the southern zone of the island [Vieira et al. (1989)].

The volcanic tunnel where the tide gauge meter is installed was formed sincethe original eruption.

The tide gauge sensor was set up under an open lake inside a lava tunnel at 137 Lanzarote island (Fig.3). The climatic effects on the instrument are partly 138 reduced by the unique natural environment. It produces a very homogeneous 139 data bank. In this paper, we selected 1788 days minute sampling data since 140 July 3, 2002. The gaps and few spikes were manually cleaned using Tsoft 141 [Van Camp and Vauterin (2005)]. All gaps were filled with zeros since it would 142 not introduce any weight on the stacking results but keep the continuity of 143 the whole series(Fig.4). 144

¹⁴⁵ 5 Application to Lanzarote tide gauge records

From the stacking function (1)to (5), we can get three types of solutions for any given time series: the amplitude and phase of single harmonic wave, the Stacking-Spectrum (SSP), and the time-period distribution of one singularity. The immediate objective is to access the stacking method as a tool for real ap-



Fig. 4. Zero mean of tide gauge records after eliminating the spikes and filling gaps, the subplot figures show the detail of rectangular marked records.

plications. For instance, we selected four tidal components (O1, T=1548mins., 150 K1, T=1436mins., M2, T=745 mins., S2,T=720 mins.). The sampling inter-151 val is one minute so that the stacking period Ts = T. First, four tidal waves 152 were separated by the stacking method (Fig5. left). Second, the SSP were 153 computed from one years' tidal gauge record with minute sampling rate. The 154 starting stacking period was 500 which was linearly increased by 1 point steps 155 until 2000. The solutions of SSP were computed by equation (1) to (4). The 156 majority tidal components were detached (Fig.5 right). 157

The origin of M2 and S2 are lunar and solar principal waves so that it is quite 158 a pure sinusoidal curve. This is not the case for the diurnal waves K1 and O1. 159 The K1 is generated by a combination effect of solar and lunar attraction. The 160 O1 is beating with K1 to produce the M1 modulation. It is a minor component 161 in oceanic tides [Melchior (1983)]. The isolated waves can be used to study 162 the transfer functions between different physical parameters. For instance, 163 the barometric effect on gravitational tidal components can be estimated by 164 comparison of stacking results from gravity and barometric pressure records 165



Fig. 5. (left), Four tidal components stacked at their center period T, the original phases were computed refer to Julian epoch. (right), The SSP of tide gauge records, Ts was started from 500 and linearly increased by 1 point minute until 2000.

166 [Van Ruymbeke et al. (2007)].

Suppose that a equally sampled time series y(t), the length of y(t) is τ , sam-167 pling interval is Δt . If one want to obtain the time-period localization of 168 single harmonic component with period T, it need to first find the minimum 169 stacking number of times Ns which must be much shorter than τ . From the 170 equations (1),(2),(3) and (5), one can get a Sliding-Stacking result. Now, we 171 select two tidal components K1 and S2 to illustrate the tool. It is assumed 172 that the minimum stacking number of times for K1 is (Ns = 90) and S2 is 173 60 (Ns = 60). Then both window functions were moved with a constant step 174 $(c\Delta t = 1440 mins)$ which was equal to one day length. The final results, a 175 time-period distribution of K1 and S2, were plotted in Fig.6. S2 amplitude 176 is modulated by long period wave which originates from the declination and 177 ellipticity of the earth orbit cycling the Sun. This effect is clearly visible from 178 the Sliding-Stacking results as variations of the envelope of the S2 wave. Lack 179 of data produced four gaps in both cases. 180

¹⁸¹ The Sliding-Stacking on K1 shows the combination effect of the common pe-



Fig. 6. (upper), sliding stacking on S2 component, the window length is 30 days after it is moved by 1 day step, (lower) sliding stacking on K1 component the window's length is 90 days with 1 day moving step.

riod lunar and solar sidereal component. Two-thirds of the energy of K1 is coming from the Moon and one-third is furnished by the Sun [Melchior (1983)]. The period of K1 is exactly two times that of its harmonic waves K2. In this case, it clearly shows that we can not separate both by 90 times stacking on K1 period, results in two maximum in the Sliding-Stacking results (Fig.6).

187 6 Conclusion

A stacking method was introduced in this paper. The tool was firstly tested with a numeric series which were consisted of three harmonic components and random white noise. The amplitude of each harmonic wave was computed by the stacking tool and DFT for different levels noisy contaminated signal. The stacking tool gave better results than the DFT for high SNR series, espe-

cially for the singularity whose frequency was a recurring decimal. Thus the 193 stacking method was reliable when the period of a harmonic wave was well 194 defined. The period of each tidal component is precisely constrained by astro-195 nomic constants which specially meets the basic requirement of the stacking. 196 Starting from the stacking function, a linear Stacking-Spectrum (SSP) and 197 Sliding-Stacking approach, were developed. They were applied to the Lan-198 zarote tide gauge records. Four tidal components (O1, K1, M2, S2) were se-199 lected to illustrate the interesting of the method. Three types of preliminary 200 results were obtained from the tide gauge records: the K1, O1, M2 and S2 201 singularities were separated from the data, the harmonic waves with periods 202 between 500 and 2000 mins were isolated by the SSP, the amplitude of K1 and 203 S2 time-period distribution were separately demonstrated by Sliding-Stacking 204 approach. But the solutions of Sliding-Stacking were strongly dependent on 205 the stacking number of times, it can be used only when the data length τ 206 are much longer the Ns. The Sliding-Stacking of the K1 constituent showed 207 the such effect in which the result included both the K1 wave and its first 208 harmonic wave K2. The stacking tools are applied to estimate the effects of 209 barometric on gravitational tidal constituents and also intensively utilized to 210 the design of geophysical instruments [Van Ruymbeke et al. (2007)]. It is also 211 possible to test the correlations between some quasi random signals with the 212 secular earth tide when the statistical tests are introduced to evaluate the 213 stacking results. For instance, the correlations between seismic activities and 214 the earth tide at Vrancea seismic zones, have been investigated by the stacking 215 approach [Cadicheanu et al. (2007)]. 216

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