

1 **Reproducibility of a new signal processing technique to assess joint sway during**  
2 **standing**

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## Abstract

21 Postural control strategies can be investigated by kinematic analysis of joint  
22 movements. However, current research is focussing mainly on the analysis of centre of  
23 pressure excursion and lacks consensus on how to assess joint movement during postural  
24 control tasks. This study introduces a new signal processing technique to comprehensively  
25 quantify joint sway during standing and evaluates its reproducibility. Fifteen patients with  
26 non-specific low back pain and ten asymptomatic participants performed three repetitions of a  
27 60-second standing task on foam surface. This procedure was repeated on a second day.  
28 Lumbar spine movement was recorded using an inertial measurement system. The signal was  
29 temporally divided into six sections. Two outcome variables (mean absolute sway and sways  
30 per second) were calculated for each section. The reproducibility of single and averaged  
31 measurements was quantified with linear mixed-effects models and the generalizability  
32 theory. A single measurement of ten seconds duration revealed reliability coefficients of .75  
33 for mean absolute sway and .76 for sways per second. Averaging a measurement of 40  
34 seconds duration on two different days revealed reliability coefficients higher than .90 for  
35 both outcome variables. The outcome variables' reliability compares favourably to previously  
36 published results using different signal processing techniques or centre of pressure excursion.  
37 The introduced signal processing technique with two outcome variables to quantify joint sway  
38 during standing proved to be a highly reliable method. Since different populations, tasks or  
39 measurement tools could influence reproducibility, further investigation in other settings is  
40 still necessary. Nevertheless, the presented method has been shown to be highly promising.

41

## **Introduction**

42 Postural control is defined as the ability to keep or regain a specific posture, such as  
43 standing (Pollock et al., 2000). Commonly, this ability is quantified by centre of pressure  
44 excursion (Mazaheri et al., 2013). Postural control strategies are described as a feedback  
45 mechanism derived by the interaction of sensory input and adapted motor output (Hodges,  
46 2004). Centre of pressure excursion represents whole body movement and does not  
47 differentiate between joints. Kinematic measures of joint sway would give more insight into  
48 postural control strategies. Joint sway was previously assessed by the standard deviation of  
49 angular displacement (Mientjes and Frank, 1999). Standard deviation is one measure of sway  
50 but quantifies only its amplitude. This study introduces a new signal processing technique  
51 with two outcome variables to comprehensively quantify joint sway, including amplitude and  
52 frequency. The technique and its clinical application are demonstrated at the lumbar spine  
53 with both, patients suffering from low back pain and asymptomatic participants. Since  
54 filtering is a major issue in movement analysis, this study presents a new approach to finding  
55 an optimal filter, evaluating the reproducibility of the outcome variables, and recommending a  
56 reliable measurement protocol.

57

## **Methods**

### **Participants**

59 Fifteen adult patients with non-specific low back pain for longer than four weeks and  
60 ten asymptomatic, adult participants were recruited for this study. A detailed description of  
61 the recruitment procedures, as well as inclusion and exclusion criteria, is provided elsewhere  
62 (Schelldorfer et al., 2015). The study was approved by the local ethics committee. All  
63 participants signed informed consent prior to the study.

### **Procedure**

64

65 Lumbar spine movement was measured at 200 Hz by an inertial measurement unit  
66 (IMU) system (ValedoMotion, Hocoma AG, Volketswil, Switzerland). IMUs were placed on  
67 the sacrum and the first lumbar vertebra (Ernst et al., 2013). The IMU system provides  
68 concurrently valid estimates of spinal kinematics (Bauer et al., 2015). Participants were  
69 blindfolded and instructed to stand with arms crossed and feet together as stable as possible  
70 for 60 seconds on a foam surface (Airex® Balance-Pad, height 6 cm). The task was repeated  
71 three times with self-selected resting periods between repetitions. The procedure was repeated  
72 within five days (mean interval and standard deviation: 2.6±1.1 days).

### 73 **Data processing**

74 Based on the differential signal between the IMUs, the lumbar spine angles for frontal  
75 plane movements were calculated (Bauer et al., 2015). The signals were filtered by  
76 fourth-order zero-phase Butterworth filters with forty different cut-off frequencies ( $f_c$ ),  
77 ranging from 1 to 40 Hz. Thereafter, the signals were divided into six sections, each of ten  
78 seconds duration. This subdivision enables recommendations about the duration of the  
79 standing task for future studies. Finally, two outcome variables were calculated for each  
80 section (Figure 1):

$$\text{mean absolute sway (MAS)} = \frac{\sum_{i=1}^n |\Delta S_i|}{n}$$

$$\text{sways per second (SPS)} = \frac{n}{T}$$

81 with  $\Delta S_i$  being the angular displacement of the  $i^{\text{th}}$  sway, defined by two consecutive local  
82 extrema,  $n$  being the total number of sways, and  $T$  being the total duration of the  
83 corresponding section.

### 84 **Statistical analysis**

85 A mixed-effects model containing three fixed effects (group: low back pain and  
86 asymptomatic, age and gender) and four fully crossed random effects (participant x day x  
87 repetition x section) was fitted for each outcome variable and  $f_c$ :

$$\log Y_{\text{gepdrs}}(f_c) = \mu + \beta_{\text{group},g} + \beta_{\text{age}} * a_p + \beta_{\text{gender},e} + P_p + D_d + R_r + S_s + PD_{pd} + PR_{pr} \\ + PS_{ps} + DR_{dr} + DS_{ds} + RS_{rs} + \varepsilon_{\text{gepdrs}}$$

$$g = 1,2; p = 1,2, \dots, 25; e = 1,2; d = 1,2; r = 1,2,3; s = 1,2, \dots, 6$$

88 with  $\beta_{\text{group}}$  as the  $g^{\text{th}}$  group effect,  $\beta_{\text{age}}$  as the age effect,  $a_p$  as the age of participant  $p$ ,  $\beta_{\text{gender}}$  as  
 89 the  $e^{\text{th}}$  gender effect,  $P$  as the random effect of participant  $p$ ,  $D$  as the random effect of day  $d$ ,  
 90  $R$  as the random effect of repetition  $r$ ,  $S$  as the random effect of section  $s$  and  $\varepsilon_{\text{gepdrs}}$  as  
 91 unexplained error. Based on residual analysis, the logs of the outcomes were modelled.

92 Choosing the optimal  $f_c$  for the Butterworth filter is a compromise between the amount  
 93 of signal distortion and the amount of noise allowed to pass through it (Winter, 2005). It was  
 94 hypothesized that a high  $f_c$  would increase the residual sum of squares, whereas a low  $f_c$   
 95 would decrease the total sum of squares. Under both scenarios, the conditional R-squared,  $R^2$   
 96 will decrease:

$$R^2 = 1 - \frac{\text{residual sum of squares}}{\text{total sum of squares}} = 1 - \frac{\sum_i (y_i - \hat{y}_i)^2}{\sum_i (y_i - \bar{y})^2},$$

97 with  $y_i$  being the observed value,  $\hat{y}_i$  being the predicted value using random and fixed effects,  
 98 and  $\bar{y}$  being the mean of observed values. The optimal  $f_c$  was therefore established by  
 99 maximizing the mean of the  $R^2$  of both outcome variables:

$$f_{c,\text{opt}} = \arg \max_{f_c} \left( \frac{R^2_{\text{MAS}}(f_c) + R^2_{\text{SPS}}(f_c)}{2} \right)$$

100 Further analyses were conducted with outcome variables of the optimally filtered signals.  
 101 Reproducibility was quantified according to the generalizability theory (Brennan, 2001) with  
 102 the universe score being the expected value of a person over the facets of generalization  $D$ ,  $R$ ,  
 103 and  $S$ . The index of dependability (reliability coefficient) of a single measurement was  
 104 computed as the ratio of universe score variance to observed score variance:

$$\varphi_{\text{single measurement}} = \frac{\sigma_P^2}{\sigma_P^2 + \sigma_{PD}^2 + \sigma_{PR}^2 + \sigma_{PS}^2 + \sigma_D^2 + \sigma_{DR}^2 + \sigma_{DS}^2 + \sigma_R^2 + \sigma_{RS}^2 + \sigma_S^2 + \sigma_\varepsilon^2}$$

105 The reliability coefficient of an average measurement was given by

$\phi_{\text{average}}(n_D, n_R, n_S)$

$$= \frac{\sigma_P^2}{\sigma_P^2 + \frac{\sigma_{PD}^2}{n_D} + \frac{\sigma_{PR}^2}{n_R} + \frac{\sigma_{PS}^2}{n_S} + \frac{\sigma_D^2}{n_D} + \frac{\sigma_{DR}^2}{n_D * n_R} + \frac{\sigma_{DS}^2}{n_D * n_S} + \frac{\sigma_R^2}{n_R} + \frac{\sigma_{RS}^2}{n_R * n_S} + \frac{\sigma_S^2}{n_S} + \frac{\sigma_\epsilon^2}{n_D * n_R * n_S}}$$

106 with  $n_D$  being the number of days,  $n_R$  the number of repetitions and  $n_S$  the duration of the  
107 measurement (e.g.  $n_S = 3: 3*10s = 30s$ ), and used to establish measurement protocols which  
108 achieve very high reliability ( $\phi_{\text{average}} \geq .90$ ) (Carter and Lubinsky, 2015).

109

## Results

110 The relationship between  $R^2$  and  $f_c$  was a reversed U-shaped curve with a maximum of  
111 .88 at 26 Hz. The corresponding  $R^2$  of MAS and SPS were .88 and .87, respectively.

112 The grand mean of MAS and SPS were 0.5 °/sway and 30.8 sways/s. The variance  
113 components of all random effects and their interactions are listed in Table 1. Averaging both  
114 outcome variables, the sum of all variances including “day” was 0.63, including “repetition”  
115 was 0.22, and including “section” was 0.12. All values are expressed relative to the residual  
116 variance.

117 The reliability coefficients of averaged measurements are illustrated in Table 2.  
118 Overall, to obtain highly reliable results, it is required to take measurements once for 40  
119 seconds on two different days and to calculate the average of each section and day. Using this  
120 design, the standard errors of measurements are 0.03 °/sway for MAS and 0.02 sways/s for  
121 SPS.

122 Fixed effects are expressed as relative changes:  $(e^{\text{fixed effect}} - 1) * 100 \%$ . Low back pain  
123 patients had 7 % higher MAS values and 3 % lower SPS values compared to asymptomatic  
124 participants. Female participants had 12 % higher MAS values and 4 % lower SPS values  
125 than male participants. The age effect for one year was plus 0.1 % for MAS values and minus  
126 0.1 % for SPS values. None of the effects were statistically significant.

## Discussion

127

128         The chosen approach to establish the optimal  $f_c$  showed a distinct maximum at 26 Hz.  
129 If the approach was applied to MAS and SPS separately, the results would have been 20 Hz  
130 and 26 Hz, respectively. However, a single  $f_c$  was preferred to maintain comparability of the  
131 results.

132         The sum of variance components including “day” as the random factor was more than  
133 twice as high as those including “repetition” or “section”. Therefore, the daily state of  
134 participants and/ or the placement of IMUs might have a high impact on the outcome  
135 variables. The reliability of MAS and SPS was .89 when averaging three repetitions and a  
136 duration of 60 seconds, which compares favourably to previously established scores using the  
137 same measurement protocol, but different outcome variables (Schelldorfer et al., 2015).  
138 Averaging over two days, three repetitions and a duration of 30 seconds, as in a previous  
139 study investigating centre of pressure measures, the reliability of MAS and SPS was .93,  
140 which is again favourable compared to previous results that ranged from .51 to .74 (Salavati et  
141 al., 2009). The sample size of the current study was smaller compared to the first study and  
142 similar compared to the second study. Still, it remains questionable how an increased sample  
143 size would have affected the current results.

144         None of the fixed effects were statistically significant and their interpretation remains  
145 questionable. The reason for including fixed effects in the model was to correct for previously  
146 established factors which affect between-participants variance ( $\sigma_p^2$ ) (Schelldorfer et al.,  
147 2015). Still,  $R^2$  of the final model was .88, meaning that 12 % of the total variance was caused  
148 by unknown factors.

149         The new signal processing technique with two outcome variables to quantify joint  
150 sway during standing is a highly reliable method when the postural control task lasts for 40  
151 seconds and is performed on two different days. The chosen outcome variables assess the  
152 amplitude and frequency of lumbar spine sway on average. They do not represent the

153 complexity of postural control during standing completely. Lumbar spine movement was  
154 chosen as an example to introduce the new technique, as a previous study demonstrated  
155 significantly altered lumbar spine sway in patients suffering from low back pain compared to  
156 asymptomatic controls (Schelldorfer et al., 2015). However, since different body joints,  
157 populations, tasks, or measurement tools could influence reproducibility, further  
158 investigations in other settings are still necessary. Nevertheless, the presented method has  
159 been shown to be highly promising.

### 160 **Conflict of interest statement**

161 None of the authors are aware of any financial or personal relationships with other  
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- 200

201 **Table 1**

202 Variance components of the random effects, expressed relatively to the variance of residuals.

	mean absolute sway (MAS)	sways per second (SPS)
$\sigma^2_P$	6.19	6.09
$\sigma^2_{PD}$	0.63	0.61
$\sigma^2_{PR}$	0.23	0.15
$\sigma^2_{PS}$	0.05	0.04
$\sigma^2_D$	0.00	0.00
$\sigma^2_{DR}$	0.01	0.02
$\sigma^2_{DS}$	0.00	0.00
$\sigma^2_R$	0.01	0.02
$\sigma^2_{RS}$	0.00	0.00
$\sigma^2_S$	0.09	0.06
$\sigma^2_D + \sigma^2_{PD} + \sigma^2_{DR} + \sigma^2_{DS}$	0.64	0.63
$\sigma^2_R + \sigma^2_{PR} + \sigma^2_{DR} + \sigma^2_{RS}$	0.25	0.18
$\sigma^2_S + \sigma^2_{PS} + \sigma^2_{DS} + \sigma^2_{RS}$	0.14	0.10
$\sigma^2_\epsilon$	1.00	1.00

203  $\sigma^2$ , relative variance; P, participant; D, day; R, repetition; S, section.

204

205 **Table 2**

206 Reliability coefficient  $\phi_{\text{average}}$ , when using the average of repeated measures.

$n_D = 1$ mean absolute sway (MAS)							$n_D = 1$ sways per second (SPS)						
$n_R \backslash n_S$	1	2	3	4	5	6	$n_R \backslash n_S$	1	2	3	4	5	6
1	.75	.81	.83	.84	.85	.85	1	.76	.82	.84	.85	.86	.86
2	.82	.85	.86	.87	.87	.88	2	.82	.86	.87	.88	.88	.88
3	.84	.87	.88	.88	.88	.89	3	.85	.87	.88	.89	.89	.89
$n_D = 2$ mean absolute sway (MAS)							$n_D = 2$ sways per second (SPS)						
$n_R \backslash n_S$	1	2	3	4	5	6	$n_R \backslash n_S$	1	2	3	4	5	6
1	.84	.88	.89	<b>.90</b>	<b>.90</b>	<b>.90</b>	1	.85	.89	<b>.90</b>	<b>.91</b>	<b>.91</b>	<b>.91</b>
2	.88	<b>.91</b>	<b>.92</b>	<b>.92</b>	<b>.92</b>	<b>.92</b>	2	.89	<b>.91</b>	<b>.92</b>	<b>.93</b>	<b>.93</b>	<b>.93</b>
3	<b>.90</b>	<b>.92</b>	<b>.93</b>	<b>.93</b>	<b>.93</b>	<b>.93</b>	3	<b>.91</b>	<b>.92</b>	<b>.93</b>	<b>.93</b>	<b>.94</b>	<b>.94</b>

207  $n_D$ , number of days;  $n_R$ , number of repetitions;  $n_S$ , number of sections; bold numbers indicate  
 208 a value higher than .90.

209

### Figure Captions

210 **Figure 1** Illustration of the outcome variables.  $\Delta S_i$  = the angular displacement of the  $i^{\text{th}}$   
211 sway, defined by two consecutive local extrema.  $n$  = the total number of sways.  $T$  = total  
212 duration of the corresponding section.