SCIENTIFIC REPORTS

natureresearch

OPEN

Dynamical Analysis of Standing Balance Control on Sloped Surfaces in Individuals with Lumbar Disc Herniation

Jinping Li^{1,4}, Yang Zhang^{2,4}, Shasha Song², Ying Hou³, Yigen Hong², Shouwei Yue^{2*} & Ke Li^{1,4}

The changes of balance control mechanism caused by lumbar disc herniation (LDH) has not been well understood. This study aimed to investigate the effects of LDH on the balance control during standing on sloped surfaces. Ten patients with LDH and 10 gender- and age-matched healthy subjects were instructed to stand quietly on a sloped surface at -5° , 0° or $+5^\circ$, respectively. The trajectories of the center of pressure (COP) of each individual limb and the full-body were recorded. Cross recurrence quantification analysis (CRQA) was applied to assess the coordination of COP components at the anterior-posterior and medial-lateral directions. The patients with LDH presented magnified inter-limb load asymmetry and had more deterministic components in the COP coordination of the less-affected limb and the full-body than the healthy subjects. The LDH led to decreased dynamical degree of freedom and less flexibility in bidirectional controlling the center of mass simultaneously. The effects of sensorimotor deficits due to LDH could be more obviously exhibited as standing on a declined rather than an inclined surface. This study shed light on the effects of LDH on standing balance control and may facilitate to develop novel strategies for evaluation of LDH.

Lumbar disc herniation (LDH) is a localized displacement of intervertebral disc tissue beyond the physiological margins of the intervertebral disc space. The prevalence of LDH is about 1–3%, mostly among the people aged between 30 and 50 years¹. The symptoms of LDH include but are not limited to low back pain, leg pain, sciatica, muscle spasm or cramping, leg weakness, loss of leg function and abnormal gait^{2,3}. Posture control during quiet standing could be vulnerable to the LDH. However, despite the accumulating evidence from the non-specific low back pain without structural change, inflammation or specific disease⁴, the potential effects of LDH on postural control for quiet standing are less studied.

To regulate balance is a preliminary request for the posture control during standing. When maintaining the body in balance, the sensory and motor systems need to be seamlessly integrated. The sensory information from visual, somatosensory and vestibular systems can facilitate the central nervous system to determine the orientation and state of body in environment⁵, make correct motion planning and issue suitable commands to the motor system⁶. The motor system, involving muscles, bones and joints, can generate a corrective, stabilizing torque to maintain the postural stability and orientation within the base of support⁷. This sensorimotor integration mechanism guarantees the fundamental requirement of balance control, and enables the body to respond to external disturbances in a timely and effective manner⁸. In LDH, deficits in the sensory system, such as reduced somatosensory sensitivity of foot sole⁹, lessened sensory nerve action potential¹⁰, abnormal H-reflex complex¹¹ and in the motor system, such as decreased muscle strength of the trunk, knees, and ankles^{12,13}, may potentially increase the sway of body and thus challenge the standing balance. More studies are deserved to specify the effects of LDH on the balance control during standing.

In contrast to the stable, horizontal surface, standing on a sloped surface further raises the difficulty of balance control, requiring promoted sensorimotor integration. The sensory system needs to provide more real-time

¹Laboratory of Motor Control and Rehabilitation, Institute of Biomedical Engineering, School of Control Science and Engineering, Shandong University, Jinan, 250061, China. ²Department of Physical Medicine and Rehabilitation, Qilu Hospital, Shandong University, Jinan, 250012, China. ³Department of Rehabilitation Medicine, The Affiliated Suzhou Hospital of Nanjing Medical University, Suzhou, 215002, China. ⁴These authors contributed equally: Jinping Li and Yang Zhang. *email: shouweiy@sdu.edu.cn; kli@sdu.edu.cn

	LDH							HC
Number	Sex	Age (y)	Level of herniation ^a	JOA ^b	ODIc	RMDQ ^d	More-affected limb	Age (y)
1	Female	56	L4-L5, L5-S1	18	16	12	Left	55
2	Male	50	L4-L5	10	32	22	Left	49
3	Female	35	L5-S1	15	23	17	Left	32
4	Female	69	L5-S1	15	24	17	Right	68
5	Male	43	L4-L5, L5-S1	14	19	9	Left	44
6	Female	61	L3-L4, L4-L5	10	23	15	Left	62
7	Male	45	L5-S1	16	26	13	Right	45
8	Male	65	L4-L5	13	28	18	Right	64
9	Female	39	L4-L5	16	10	6	Right	42
10	Female	45	L5-S1	15	16	11	Left	44
Mean		50.80		14.20	21.70	14.00		50.50
SD		11.46		2.57	6.52	4.74		11.41

 Table 1. Characteristics of subjects. ^aL: Lumbar spine; S: Sacrum; ^bJOA: Japanese Orthopaedic Association

 Scores; ^cODI: Oswestry Disability Index; ^dRMDQ: Roland Morris Disability Questionnaire.

sensory information about the altered perpendicular relationship between the support surface and gravitational vertical due to the slope; and the motor system should generate well-organized muscle activations and appropriate forces against the effects of slope. Examination of the balance control when standing on a sloped support surface may facilitate to clarify the relative contributions of the support surface and the gravity as reference frames for postural orientation^{14–17} and to detect the altered lower-limb muscle contraction and synergy for balance control^{18,19}.

The balance control during standing can be approximated to a single inverted pendulum rotating around feet. The trajectory of center of pressure (COP) — the mean position of the forces acting under the feet at any instant in time, is strongly related to the movements of the body's center of mass and can serve as an effective indicator for balance control. The COP trajectories are characterized by non-stationary, time- variation and complex temporal-spatial structures. Quantifying such temporal-spatial structures entails suitable analytical tools. Traditional time- or frequency domain approaches usually show limitations in analyzing the highly complex, nonlinear and nonstationary COP signals. Nonlinear dynamical analyses, such as the entropy, Lyapunov exponent or detrended fluctuation analysis, have been applied in assessment of the COP signals and helped to find out the dynamical patterns underlying the balance control in either the anterior-posterior (AP) and medial-lateral (ML) directions. Considering the posture should be controlled in both the AP and ML directions simultaneously during standing, it would be beneficial to quantify the dynamical coordination of the COPs in AP and ML directions. Recently, the cross recurrence quantification analysis (CRQA) has been developed as an advanced tool in assessment of dynamical coordination of nonlinear, nonstationary neurophysiological signals, and has been used in examination of the COP coordination between the AP and ML directions²⁰⁻²². The measures derived from CRQA provide insights into the deterministic or stochastic components, structural complexity, periodic patterns, or synchronization underlying the dynamical COP coordination across the AP and ML directions. An intriguing issue is whether the CRQA parameters could reflect the potential changes in the bidirectional COP coordination as standing on a sloped surface, and disclose the LDH induced alterations in the highly fuzzy, complex, and dynamic balance control.

This study aimed to investigate the effects of LDH on the balance control during standing on a slope. The dynamical coordination of COP in the AP and ML directions were quantified using the CRQA. It is hypothesized that the patients with LDH would show more severe asymmetry of the load distribution between legs, and had more deterministic components in the COP coordination between the AP and ML directions than the healthy individuals.

Methods

Subjects. Ten patients with LDH and 10 gender- and age-matched healthy control (HC) subjects participated in the experiment. All the patients had been clinically diagnosed with LDH from the Department of Orthopedic, Qilu Hospital, Shandong University. The individuals who had history of cardiovascular, cerebrovascular or vestibular diseases, or musculoskeletal injuries on their lower-extremity were excluded. The patients received physical assessment of the symptoms and severity of LDH including the pressure and radiating pain, spasm, superficial sensation and muscle strength, and dysfunction assessment through three scales – Japanese Orthopaedic Association Scores (JOA), Oswestry Disability Index (ODI) and Roland Morris Disability Questionnaire (RMDQ) from the Department of Physical Medical and Rehabilitation, Qilu Hospital, Shandong University. The more- and less-affected limb of LDH patients were defined by above-mentioned physical assessment. If one leg had more serious symptoms compared with the other leg, it was marked as the more-affected limb. Meanwhile, the other was the less-affected limb. The characteristics of subjects are shown in Table 1. The study was carried out in accordance with the 1964 Helsinki declaration and its later amendments or comparable ethical standards. All participants provided their written informed consent following the protocols approved by the Institutional Review Board of Shandong University.



Figure 1. The schematic diagram of the experiment set-up and foot plantar pressure distributions from a representative patient with LDH. (a) Declined surface at -5° ; (b) horizontal surface at 0° ; (c) inclined surface at $+5^\circ$; (d), (e) and (f) are foot plantar pressure distributions corresponding to (a), (b), (c), respectively.

Experimental set-up. A force platform (FDM-S, Zebris Medical GmbH, Isny, Germany) covered with 64*40 pressure sensors was used to measure the foot plantar pressure distributions at a sampling frequency of 60 Hz. The COP time series were processed in the MATLAB R2017b (The Mathworks, Natick, MA, USA). Parameters of CRQA were implemented with the cross recurrence plot toolbox 5.16²³.

Test procedures. The schematic diagram of the experiment set-up is depicted in Fig. 1. Subjects were required to stand barefoot quietly on the center of the force platform for 30 s, with their feet side by side, their hands naturally on both sides of body and their eyes gaged forward. Three angles of the force platform surface, including -5° , 0° and $+5^\circ$ with respect to the horizontal plane, were tested with a random sequence. For each surface angle, only one trial was performed by each subject. A 5-min rest was given between trials. In order to

avoid the influence of free body swing, the data for the first and last 5 s was removed, leaving the middle 20 s for the further analysis.

Data analysis. In order to explore whether patients with LDH shifted the load from the more-affected limb to the less-affected limb, we calculated the limb load asymmetry (LLA), which was defined as the ratio of the loads on the less-affected to on the more-affected limb^{16,22,24,25}:

$$LLA = \frac{Load \text{ on } Less - affected \ Limb}{Load \ on \ More - affected \ Limb}$$
(1)

For the healthy individuals, the more- or less-affected limbs were determined in accordance with their counterpart patients with LDH²⁶.

The COP was calculated from the signals recorded by each pressure sensor as follows:

$$AP = \frac{\sum F_i * Y_i}{\sum F_i} \tag{2}$$

$$ML = \frac{\sum F_i * X_i}{\sum F_i} \tag{3}$$

where the *AP* and *ML* represent the COP coordinates at one moment in the AP and ML directions, respectively; *i* is the number of pressure sensors, F_i is the force on the *i*th unit area, and (X_i, Y_i) is the coordinate of the *i*th sensor. The COP of the more-affected limb (COP_M), less-affected limb (COP_L) and the full-body (COP_{net}) were computed according to the formula (2) and (3). Figure 1 shows the distributions of foot plantar pressure at a moment from a representative patient with LDH as standing on the force platform at different angles.

In order to quantify the characteristics of dynamical coordination between AP and ML directions, the COP time series in the two directions need to be reconstructed and projected into a phase space with appropriate parameters. The time delay and embedding dimension, two parameters essential for phase-space reconstruction, were determined by mutual information and false nearest neighbors in this study. Eventually, the time delay at 6 samples and the embedding at 4 were determined and used in the following CRQA analysis. A window with 600 sample points and an overlap of 300 sample points were applied on the signal series to quantify the characteristics of the dynamical coordination for COP trajectories. The mean values of all the windows were calculated for each subject.

The dynamical coordination of COP in AP and ML directions were further quantified by the CRQA, which provides a quantification of a cross recurrence matrix (CR):

$$CR_{i,j}^{\tau,m} = \Theta(\varepsilon - \|u(i) - v(j)\|)$$
⁽⁴⁾

where the u(i) and v(j) are the phase-space vectors corresponding to COP series in AP and ML directions; i, j = 1, ..., N, N is the length of COP series; τ and m are the predefined time delay and embedding dimension, respectively; ε is the threshold and was set to 30% of the maxim phase space radius. The Θ is the Heaviside function and || || is the Euclidean norm. The CR contains all the recurrence states between two trajectories of time series reconstructed in the phase space. A visualization of CR is cross recurrence plot (CRP). We used the cross recurrence rate (X-RR), cross determinism (X-DET) and cross entropy (X-ENT) to quantify the structure of the CRP. The X-RR is defined as:

$$X - RR = \frac{1}{N^2} \sum_{i,j=1}^{N} CR_{i,j}$$
(5)

where the X-RR indicates the regularity by measuring the density of recurrence points in the CRP²³. The greater X-RR indicates greater correlation between the COP series in the AP and ML directions. The X-DET is defined as:

$$X-DET = \frac{\sum_{l=l_{min}}^{N} l * P(l)}{\sum_{l=1}^{N} l * P(l)}$$
(6)

where *l* is the diagonal sequence of recurrence points, l_{min} is the least length, equaling to 2; P(l) is the frequency distribution of the lengths of the diagonal lines. The X-DET is the ratio of recurrence points that form diagonal structures to all recurrence points, relating to deterministic of dynamical system²³. The X-ENT is defined as:

$$X-ENT = -\sum_{l=l_{min}}^{N} p(l) * \ln(p(l))$$
(7)

where p(l) is the probability of a diagonal line, estimated from $P(l)^{23}$. The X-ENT reflects the complexity of the deterministic structures in the dynamical coupling of COP²³.

All statistical analyses were performed using SPSS 23.0 (SPSS Inc., Chicago, IL). Kolmogorov-Smirnov test was used to examine the data distribution. A two-way repeated measures ANOVA was applied to examine the differences of the CRQA parameters for the COP_L , COP_M and COP_{net} , with the groups (LDH vs. HC) as between-subject factor and angles (-5° , 0° , $+5^\circ$) as within-subject factor. The Huynh-Feldt correction was used when the assumption of sphericity was violated. Post-hoc multiple pairwise comparisons were corrected by



Figure 2. The mean and standard deviations of the time series of the limb load asymmetry (LLA) for all the patients with LDH and the healthy subjects (HC). (a) Declined surface at -5° ; (b) horizontal surface at 0° ; (c) inclined surface at $+5^\circ$.





Bonferroni correction. An independent *t*-test was applied to examine the differences between the LDH and HC groups. A *p*-value less than 0.05 was considered as statistical significant.

Results

The time series of LLA are depicted in Fig. 2. Different from the healthy subjects whose LLAs were close to 1 $(-5^\circ: 0.982 \pm 0.147; 0^\circ: 0.982 \pm 0.137; +5^\circ: 0.962 \pm 0.178)$, the LDH patients showed LLAs much higher than 1 with greater standard deviations $(-5^\circ: 1.152 \pm 0.284; 0^\circ: 1.086 \pm 0.282; +5^\circ: 1.151 \pm 0.332)$. In addition, the LDH group had higher LLA values at sloped surfaces compared with that at 0°.

Figure 3 exhibits the representative COP_{net} trajectories in the AP and ML directions and the CRPs from a patient with LDH and a healthy subject when standing on the force platform. Compared with the healthy subject, the LDH patient had more recurrence points and linear structures along the diagonal in the CRP, reflecting more regular and deterministic structures in coordinating the COP components between the AP and ML directions when maintaining the standing balance.

Results of the CRQA for COP of each limb are shown in Fig. 4. The X-DET of COP_L showed significant differences between groups ($F_{1.18} = 5.722$, p = 0.028): the patients with LDH showed significantly higher X-DET of



Figure 4. Statistical results of the CRQA analysis for the less- and more-affected limbs. *Significant difference between the LDH and HC groups (p < 0.05); *significant difference across the slope angles (p < 0.05).





Figure 5. Statistical results of CRQA analysis of the full-body COP. *Significant difference between the LDH and HC groups (p < 0.05); *significant difference across the slope angles (p < 0.05).

 COP_{L} than the healthy individuals at -5° (t = 2.368, p = 0.029) and 0° (t = 2.105, p = 0.050, Fig. 4b). Effects of slope angles were only observed in the CRQA parameters of the LDH group, rather than the healthy subjects. Specifically, the X-RRs of the COP_L and COP_M of the LDH patients at 0° were significantly higher than those at -5° (COP_L: p = 0.027, COP_M: p = 0.023, Fig. 4a). No significant difference of the X-RRs was observed between the 0° and $+5^{\circ}$. Neither, no significant difference was found between angles for the X-DET. With respect to the horizontal plane, significantly lower X-ENT of COP_L was found on -5° (p = 0.012) and $+5^{\circ}$ (p = 0.005, Fig. 4c) slopes. By contrast, no significant difference was found between the angles for the X-ENT of COP_M.

Figure 5 shows the results of CRQA for the COP_{net}. Significant differences between the LDH and HC groups were observed in the X-DET ($F_{1,18}$ = 4.964, p = 0.039) and X-ENT ($F_{1,18}$ = 4.451, p = 0.049). The patients with LDH exhibited significantly higher X-DET (t = 2.532, p = 0.021, Fig. 5b) and higher X-ENT (t = 2.623, p = 0.017, Fig. 5c) than the healthy subjects at 0°. No significant difference was observed between the two groups in the X-RR. Effects of slopes were only found in the X-RR of HC group ($F_{2,36}$ = 8.244, p = 0.001), showing significantly lower X-RR at +5° than 0° (p = 0.017, Fig. 5a).

Discussion

This study investigated the effects of LDH on the balance control during standing on sloped surfaces. The load asymmetry was quantified using LLA; and the dynamical coordination of COP components between the AP and ML directions was analyzed for each limb and the full-body using the X-RR, X-DET and X-ENT of CRQA.

The results of LLA indicated augmented asymmetry in the load distribution between legs in LDH (Fig. 3). Compared with the healthy subjects, the patients with LDH showed much higher LLA, implying that their less-affected limb bore more weight than the more-affected limb. These results corroborate with the previous findings that the degree of lower back pain correlated with the weight-bearing asymmetry between legs²⁷. The results of the current study suggest that the patients with LDH prefer to transfer the load from the more-affected limb to the less-affected limb, thereby magnifying their inter-limb asymmetry during standing. In addition, the LLA of the patients showed much higher standard deviations than that of the healthy subjects, suggesting a greater variations in the load distributions between the two legs due to LDH. Clinical observations suggest that when standing on a sloped surface, the patients with LDH, rather than the healthy subjects, showed higher but more variant LLA. These results suggest that standing on a sloped surface could facilitate to present the effects of LDH, specifically, the augmented load-distribution asymmetry and load-sharing variation between legs.

The effects of LDH on the COP coordination between the AP and ML directions were observable from the X-DET of the less-affected limb (Fig. 4b). On the 0° and -5° surfaces, the X-DET of COP_L in LDH group was higher than that of HC group for the less-affected leg. The increased X-DET in LDH indicates more regular and deterministic temporal structures in coordinating the COP between the AP and ML directions than the healthy subjects, revealing decreased dynamical degree of freedom, limited adaptability to potential external perturbations, and increased restriction on balance control due to the LDH. The LDH-induced X-DET increase was only observed from the COP_L, suggesting a decreased flexibility in the dynamical COP coordination between the AP and ML directions on the less-affected leg, which is consistent with the previous findings that the extremity bearing heavier load presented strengthened COP coupling³⁰. In addition, previous studies suggested that the less-loaded foot could compensate for the loss of flexibility of the more-loaded foot during standing³¹. But in the current study, although the more-affected leg were less loaded than the less-affected leg in LDH, no significant difference of COP_M was observed in the X-DET between LDH and HC groups, revealing a limited shift of the flexibility in the COP coordination between two legs due to LDH.

Patients with LDH also showed increased X-DET and X-ENT in the COP_{net} than the healthy subjects (Fig. 5). The higher X-ENT indicated increased complexity of the deterministic structures in the dynamical coupling of COP²³. This result suggests that the difference in flexibility of the single-leg COP coordination between the LDH and HC groups may also influence their full-body COP coordination. The increased X-DET and X-ENT of the full-body COP coordination revealed a decreased dynamical degree of freedom, limited adaptability to the potential external perturbations, and less flexibility in controlling the center of mass in the AP and ML directions simultaneously. These changes would be highly related to the sensorimotor impairments induced by the LDH. As a disc herniates and spills into the spinal canal, the compression of the spinal cord or the nearby nerve roots could debilitate the sensorimotor function of the lower extremity^{9,11,32}. Standing is charged by a complex closed-loop feedback control mechanism, which integrates the sensory information from visual, vestibular and somatosensory systems and generates appropriate muscle forces and body orientations to maintain balance. The sensorimotor deficits due to LDH could interfere with this control mechanism by disturbing the detection and processing of the real-time sensory information, and weakening the muscle force production and coordination that are necessary for prompt and effective balance control. To counter the effects of sensorimotor deficits, the central nervous system would rely more on a feedforward mechanism based on default modes, sensorimotor memories or experiences, rather than the close-loop feedback control strategy^{33,34}. The reinforced feedforward mechanism can compensate for the LDH-induced sensorimotor deficits, rendering stronger coupling and more deterministic structures of the full-body COP coordination. This would be in line with the previous findings that sensorimotor deficits due to aging or low back pain could result to decreased complexity of postural sway³³ and reduced flexibility in postural control³⁵.

Results further showed that the X-RR and X-ENT of the COP coordination on each leg (COP_L and COP_M in Fig. 4), and the X-RR of the full-body COP (COP_{net} in Fig. 5a) were significantly decreased when standing on sloped surfaces than on the horizontal surface, especially in the patients with LDH. The lower X-RR was related to decreased correlation between the COP components at the AP and ML directions; and the lower X-ENT indicated decreased complexity of the deterministic structures in the dynamical coupling of the AP- and ML-COP components²³. In a recent study, Dutt-Mazumder *et al.*³⁶ examined the COP of healthy subjects as standing on surfaces at different angles including $+20^\circ$, $+10^\circ$, 0° , -10° , -20° , -30° , -35° , and found that the COP dynamics on a flat surface were recurrent with an augmented deterministic process and higher Shannon entropy compared to elevated slope angles in dorsiflexion and plantarflexion. Consistent with this finding, the results of the current study further pointed out that standing on a sloped surface could result in increased randomness but decreased complexity in the directional coupling of COP compared with the horizontal surface. The changes in bidirectional coupling of COP could be associated with increased postural instability^{37,38} and direction-specific sway³⁸, and would be resultant from the alteration of reference frame regarding gravity, support surface and posture orientation^{16,17}, or the different muscle activations and synergies contributing to ankle stiffness^{18,39}.

It would be noteworthy that the differences between the LDH and HC groups were observed in X-DET at -5° and 0°. In addition, the patients with LDH showed lower X-RR and X-ENT values at -5° with respect to 0°. These results partially confirmed our hypothesis that standing on a slope could facilitate to present the effects of LDH on the balance control by decreasing the dynamical degree of freedom, confining the adaptability and reducing the flexibility in the AP and ML directions simultaneously. Standing on a sloped surface would cause greater challenges in controlling the center of mass, particularly with the deteriorated sensorimotor function in LDH. In addition, previous studies found that the LDH can result in lower ankle dorsiflexor strength and make patients show a foot-drop gait¹³. The declined surface at -5° could thus intensify the deficiency in ankle dorsiflexion, whereas the inclined surface at $+5^{\circ}$ may effectively counteract this effect. This would help to interpret the difference in X-DET observed in the declined rather than the inclined surface.

This study may have some limitations. The magnitudes of pain were not precisely evaluated in the experiment. Therefore, we could not achieve quantitative assessment of the effects of pain/discomfort due to LDH on the postural stability. Moreover, the limited number of subjects did not allow us to explore the relationship between the magnitude of pain and postural stability. More subjects with accurately evaluated pain should be examined in order to clarify the effects of pain or discomfort arising from the LDH on the postural stability in future.

Conclusions

This study investigated the effects of LDH on the balance control during standing on sloped surfaces. Results showed that the patients with LDH preferred to transfer the load from the more-affected limb to the less-affected limb, and thus magnified their inter-limb asymmetry during standing. The LDH led to decreased dynamical degree of freedom, limited adaptability to potential external perturbations, and less flexibility in controlling the center of mass in the AP and ML directions simultaneously. Compared with the horizontal surface, standing on a

sloped surface could result in increased randomness but decreased flexibility in the bidirectional coupling of COP, suggesting an weakened feedback mechanism but a reinforced feedforward mechanism underlying the balance control. This study shed light on the effects of LDH on standing balance control and may facilitate to develop novel strategies for evaluation of LDH.

Data availability

The datasets are available from the corresponding author on reasonable request.

Received: 19 August 2019; Accepted: 15 January 2020; Published online: 03 February 2020

References

- 1. Jordan, J., Konstantinou, K. & O'Dowd, J. Herniated lumbar disc. BMJ clinical evidence 2009, 1118 (2009).
- Huang, Y. et al. Gait adaptations in low back pain patients with lumbar disc herniation: Trunk coordination and arm swing. European Spine Journal 20, 491–499, https://doi.org/10.1007/s00586-010-1639-8 (2011).
- 3. Morag, E., Hurwitz, D. E., Andriacchi, T. P., Hickey, M. & Andersson, G. B. J. Abnormalities in Muscle Function During Gait in Relation to the Level of Lumbar Disc Herniation. *Spine* **25**, 829–833 (2000).
- O'Sullivan, P. Diagnosis and classification of chronic low back pain disorders: Maladaptive movement and motor control impairments as underlying mechanism. *Manual Therapy* 10, 242–255, https://doi.org/10.1016/j.math.2005.07.001 (2005).
- Diener, H. C. & Dichgans, J. In Progress in Brain Research Vol. 76 (eds eds Pompeiano, O. & Allum, J. H. J.) 253–262 (Elsevier, 1988).
 Flanagan, J. R. & Wing, A. M. The Role of Internal Models in Motion Planning and Control: Evidence from Grip Force Adjustments during Movements of Hand-Held Loads. The Journal of Neuroscience 17, 1519, https://doi.org/10.1523/ JNEUROSCI.17-04-01519.1997 (1997).
- Runge, C. F., Shupert, C. L., Horak, F. B. & Zajac, F. E. Ankle and hip postural strategies defined by joint torques. *Gait & Posture* 10, 161–170, https://doi.org/10.1016/S0966-6362(99)00032-6 (1999).
- Balasubramaniam, R. & Wing, A. M. The dynamics of standing balance. Trends in Cognitive Sciences 6, 531–536, https://doi. org/10.1016/S1364-6613(02)02021-1 (2002).
- Frost, L. R., Bijman, M., Strzalkowski, N. D. J., Bent, L. R. & Brown, S. H. M. Deficits in foot skin sensation are related to alterations in balance control in chronic low back patients experiencing clinical signs of lumbar nerve root impingement. *Gait & Posture* 41, 923–928, https://doi.org/10.1016/j.gaitpost.2015.03.345 (2015).
- Levin, K. H. L5 radiculopathy with reduced superficial peroneal sensory responses: intraspinal and extraspinal causes. *Muscle & nerve* 21, 3–7, https://doi.org/10.1002/(SICI)1097-4598(199801)21:1 (1998).
- Floman, Y., Liram, N. & Gilai, A. N. Spinal manipulation results in immediate H-reflex changes in patients with unilateral disc herniation. *European Spine Journal* 6, 398–401, https://doi.org/10.1007/BF01834067 (1997).
- Ho, C.-W. et al. Isokinetic Muscle Strength of the Trunk and Bilateral Knees in Young Subjects With Lumbar Disc Herniation. Spine 30, E528–E533, https://doi.org/10.1097/01.brs.0000179307.34310.7d (2005).
- Aono, H. et al. Surgical Outcome of Drop Foot Caused by Degenerative Lumbar Diseases. Spine 32, E262–E266, https://doi. org/10.1097/01.brs.0000259922.82413.72 (2007).
- Mergner, T. & Rosemeier, T. Interaction of vestibular, somatosensory and visual signals for postural control and motion perception under terrestrial and microgravity conditions—a conceptual model. *Brain Research Reviews* 28, 118–135, https://doi.org/10.1016/ S0165-0173(98)00032-0 (1998).
- Mergner, T., Maurer, C. & Peterka, R. J. In Sensorimotor Control of Movement and Posture (eds Gandevia, S. C., Proske, U. & Stuart, D. G.) 147–152 (Springer US, 2002).
- Kluzik, J., Horak, F. B. & Peterka, R. J. Differences in preferred reference frames for postural orientation shown by after-effects of stance on an inclined surface. *Experimental Brain Research* 162, 474–489, https://doi.org/10.1007/s00221-004-2124-6 (2005).
- Kluzik, J., Peterka, R. J. & Horak, F. B. Adaptation of postural orientation to changes in surface inclination. *Experimental Brain Research* 178, 1–17, https://doi.org/10.1007/s00221-006-0715-0 (2007).
- Sasagawa, S., Ushiyama, J., Masani, K., Kouzaki, M. & Kanehisa, H. Balance control under different passive contributions of the ankle extensors: quiet standing on inclined surfaces. *Experimental Brain Research* 196, 537–544, https://doi.org/10.1007/s00221-009-1876-4 (2009).
- 19. Li, J., Li, K., Wei, N., Yue, S. & Yin, C. In 2017 Chinese Automation Congress (CAC). 4882-4885.
- King, A. C., Wang, Z. & Newell, K. M. Asymmetry of recurrent dynamics as a function of postural stance. *Experimental Brain Research* 220, 239–250, https://doi.org/10.1007/s00221-012-3133-5 (2012).
- Kinsella-Shaw, J., Harrison, S. & T Turvey, M. Interleg Coordination in Quiet Standing: Influence of Age and Visual Environment on Noise and Stability. *Journal of Motor Behavior* 43, 285–294, https://doi.org/10.1080/00222895.2011.580389 (2011).
- Kinsella-Shaw, J. M., Harrison, S. J., Carello, C. & Turvey, M. T. Laterality of quiet standing in old and young. *Experimental Brain Research* 231, 383–396, https://doi.org/10.1007/s00221-013-3696-9 (2013).
- Marwan, N., Carmen Romano, M., Thiel, M. & Kurths, J. Recurrence plots for the analysis of complex systems. *Physics Reports* 438, 237–329, https://doi.org/10.1016/j.physrep.2006.11.001 (2007).
- Al-Eisa, E., Egan, D., Deluzio, K. & Wassersug, R. Effects of Pelvic Skeletal Asymmetry on Trunk Movement: Three-Dimensional Analysis in Healthy Individuals Versus Patients With Mechanical Low Back Pain. Spine 31, E71–E79, https://doi.org/10.1097/01. brs.0000197665.93559.04 (2006).
- 25. Luchtmann, M. & Firsching, R. Lumbar disc herniation: Evidence-based guidelines-a review. Vol. 69 (2016).
- Wang, W., Li, K., Yue, S., Yin, C. & Wei, N. Associations between lower-limb muscle activation and knee flexion in post-stroke individuals: A study on the stance-to-swing phases of gait. *PLOS ONE* 12, e0183865, https://doi.org/10.1371/journal.pone.0183865 (2017).
- Childs, J. D., Piva, S. R., Erhard, R. E. & Hicks, G. Side-to-side weight-bearing asymmetry in subjects with low back pain. *Manual Therapy* 8, 166–169, doi: 10.1016/S1356-689×(03)00014-6 (2003).
- Ringheim, I., Austein, H., Indahl, A. & Roeleveld, K. Postural strategy and trunk muscle activation during prolonged standing in chronic low back pain patients. *Gait & Posture* 42, 584–589, https://doi.org/10.1016/j.gaitpost.2015.09.008 (2015).
- Wiltman, S. & Chambers, A. Weight Shifting Strategies and Discomfort during Prolonged Standing. Proceedings of the Human Factors and Ergonomics Society Annual Meeting 61, 1360–1364, https://doi.org/10.1177/1541931213601823 (2017).
- Wang, Z. & Newell, K. M. Asymmetry of foot position and weight distribution channels the inter-leg coordination dynamics of standing. *Experimental Brain Research* 222, 333–344, https://doi.org/10.1007/s00221-012-3212-7 (2012).
- Rietdyk, S. *et al.* Postural Asymmetries in Response to Holding Evenly and Unevenly Distributed Loads During Self-Selected Stance AU - Haddad, Jeffrey M. *Journal of Motor Behavior* 43, 345–355, https://doi.org/10.1080/00222895.2011.596169 (2011).
- Mondelli, M. et al. Sensory nerve action potential amplitude is rarely reduced in lumbosacral radiculopathy due to herniated disc. Clinical Neurophysiology 124, 405–409, https://doi.org/10.1016/j.clinph.2012.07.020 (2013).

- Manor, B. et al. Physiological complexity and system adaptability: evidence from postural control dynamics of older adults. Journal of applied physiology (Bethesda, Md.: 1985) 109, 1786–1791, https://doi.org/10.1152/japplphysiol.00390.2010 (2010).
- Li, K., Wei, N., Cheng, M., Hou, X. & Song, J. Dynamical Coordination of Hand Intrinsic Muscles for Precision Grip in Diabetes Mellitus. *Scientific Reports* 8, https://doi.org/10.1038/s41598-018-22588-z (2018).
 Brumagne, S., Janssens, L., Knapen, S., Claeys, K. & Suuden-Johanson, E. Persons with recurrent low back pain exhibit a rigid
- Brumagne, S., Janssens, L., Knapen, S., Claeys, K. & Suuden-Johanson, E. Persons with recurrent low back pain exhibit a rigid postural control strategy. *European Spine Journal* 17, 1177–1184, https://doi.org/10.1007/s00586-008-0709-7 (2008).
- Dutt-Mazumder, A., King, A. C. & Newell, K. M. Recurrence dynamics reveals differential control strategies to maintain balance on sloped surfaces. Gait & Posture 69, 169–175, https://doi.org/10.1016/j.gaitpost.2019.01.040 (2019).
- Dutt-Mazumder, A., Slobounov, S. M., Challis, J. H. & Newell, K. M. Postural Stability Margins as a Function of Support Surface Slopes. PLOS ONE 11, e0164913, https://doi.org/10.1371/journal.pone.0164913 (2016).
- Simeonov, P. I., Hsiao, H., Dotson, B. W. & Ammons, D. E. Control and Perception of Balance at Elevated and Sloped Surfaces. *Human Factors* 45, 136–147, https://doi.org/10.1518/hfes.45.1.136.27232 (2003).
- Lu, M.-L., Kincl, L., Lowe, B., Succop, P. & Bhattacharya, A. Muscular activity of lower limb muscles associated with working on inclined surfaces. *Ergonomics* 58, 278–290, https://doi.org/10.1080/00140139.2014.968634 (2015).

Acknowledgements

This work was supported by National Natural Science Foundation of China (31200744, 81472159), Shandong Provincial Natural Science Foundation (ZR2017MF002), Key Research & Development Programs of Shandong Province (2017G006014, 2019GSF108164), and Young Scholars Program of Shandong University. The authors appreciated the participations of all the subjects in the experiment.

Author contributions

Y.Z., K.L. and S.Y. conceived the idea. K.L., Y.Z. and J.L. designed the experiments. J.L., S.S. and Y.G.H. performed the experiments. Y.H. provided guidance and advices. J.L. and S.S. analyzed the results. J.L. and Y.Z. interpreted the results. J.L. wrote the original manuscript. J.L., K.L., Y.Z., S.Y., S.S., Y.H. and Y.G.H. reviewed and edited the manuscript. All authors have read and approved the final version of the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to S.Y. or K.L.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2020