

Title: Identifying muscle function-based phenotypes associated with radiographic progression of secondary hip osteoarthritis: A prospective cohort study

Abstract

Objective: The purposes of our study were to (1) identify muscle function-based clinical phenotypes in patients with hip osteoarthritis (OA) and (2) determine the association between those phenotypes and radiographic progression of hip OA.

Design: Prospective cohort study.

Setting: Clinical biomechanics laboratory of a university.

Participants: Fifty female patients with mild-to-moderate secondary hip OA were recruited from the orthopaedic department of a single institution.

Interventions: Not applicable.

Main Outcome Measures: Two-step cluster analyses were performed to classify the patients, using hip flexion, extension, abduction, and external/internal rotation muscle strength (cluster analysis 1); relative hip muscle strength to total hip strength (i.e., hip muscle strength balance; cluster analysis 2); and both hip muscle strength and muscle strength balance (cluster analysis 3) as variables. The association between the phenotype and hip OA progression over 12 months (indicated by joint space width [JSW] >0.5mm) was investigated by logistic regression analyses. Hip joint morphology, hip pain, gait speed, physical activity, Harris hip score, and SF-36 scores were compared between the phenotypes.

Results: Radiographic progression of hip OA was observed in 42% of the patients. The patients were classified into two phenotypes in each of the three cluster analyses. The solution in cluster analyses 1 and 3 was similar, and high-function and low-function phenotypes were identified; however, no association was found between the phenotypes and hip OA progression. The phenotype 2-1 (high-risk phenotype) extracted in cluster analysis 2, which had relative muscle weakness in hip flexion and internal rotation, was associated with subsequent hip OA progression, even after adjusting for age and minimum JSW at baseline (adjusted odds ratio [95% confidence interval], 3.60 [1.07–12.05]; $p = 0.039$).

Conclusion: As preliminary findings, the phenotype based on hip muscle strength balance, rather than hip muscle strength, may be associated with hip OA progression.

(297 words)

Keywords: Osteoarthritis, Muscle Strength, Phenotype, Cluster analysis, Disease Progression

List of abbreviations:

AHI; acetabular head index

ARO; acetabular roof obliquity

BMI; body mass index

CE; center edge

HHS; Harris hip score

ICC; intraclass correlation

JSW; joint space width

MDC₉₅; minimal detectable change at 95% confidence level

OA; osteoarthritis

SEM; standard error of the measurement

1 **Introduction**

2
3 Joint stability is achieved by a combination of static and dynamic stabilizers¹, and muscle force
4 plays a leading role as a dynamic stabilizer^{2,3}. Muscle weakness causes a decrease in the muscle
5 force available for joint stability during weight-bearing activities, subsequently, leading to a limp,
6 such as Trendelenburg gait⁴. Furthermore, because muscle forces provide compression of the
7 femoral head into the acetabular concavity, a decrease in hip muscle forces can cause
8 microinstability of the hip joint³. Muscle strength is more important in patients with acetabular
9 dysplasia or borderline dysplasia, a precursor to hip osteoarthritis (OA), who are susceptible to
10 microinstability due to insufficient static stabilizers and bone deformation^{5,6}.

11
12 Muscle weakness is major impairment in patients with hip OA, along with joint pain and
13 limited range of joint motion. Hip muscle strength is reduced by about 20% in patients with hip OA
14 on the affected side compared to healthy individuals or the contralateral side⁷. Even patients with
15 mild-to-moderate hip OA and acetabular dysplasia have been reported to have reduced hip muscle
16 strength, especially in flexion, extension, and abduction^{8,9}. Hip muscle weakness in such patients,
17 who depend more on dynamic than static stabilizers, may cause worsening joint instability and,
18 therefore, progression of hip OA.

19
20 While muscle weakness is common in patients with hip OA, heterogeneity of muscle
21 weakness is also known⁷. This heterogeneity includes individual differences among patients and
22 differences in hip muscle strength in different directions in the same patient. This evidence suggests
23 that clinical phenotypes in hip OA based on muscle function exist; for instance, patients who have
24 overall decreased hip muscle strength and patients who have decreased specific muscle strength,
25 such as in hip flexion and abduction. Given that the force of each hip muscle can affect the
26 magnitude and direction of the hip contact force^{10,11} and contributes to the stability of the femoral
27 head against the acetabulum^{2,3}, imbalance of the hip muscle forces may exacerbate hip
28 microinstability and hip OA. Standing posture, gait-related kinematic/kinetic features, and spinal
29 flexibility have been reported as modifiable risk factors for the progression of hip OA¹²⁻¹⁴.

However, no study has demonstrated the phenotypes based on muscle function, and their association with radiographic progression of hip OA, despite hip muscle strength being recommended as a core domain for clinical assessment and clinical trials in patients with hip OA^{15,16}. Since muscle strength is generally measured and readily assessed by clinicians, it is clinically important to clarify the muscle function-related risk factors that lead to hip OA progression. Understanding the potentially-modifiable variables associated with hip OA progression could inform future options for targeted rehabilitation.

The aims of our study were to (1) identify muscle function-based clinical phenotypes in patients with hip OA and (2) determine the association between those phenotypes and radiographic progression of hip OA. We hypothesized that phenotypes based on muscle strength balance are more strongly associated with hip OA progression than phenotypes based on muscle strength.

Methods

Participants

Patients were recruited continuously from April 2013 to March 2015 from the orthopaedic department of a single institution. The inclusion criteria were as follows: (1) diagnosis of pre-osteoarthritis (acetabular dysplasia defined by hip pain, a lateral center edge (CE) angle $<25^\circ$, and a Sharp angle $>45^\circ$ with no other abnormal radiographic findings), early hip OA (slight joint space narrowing and abnormal subchondral sclerosis), or advanced hip OA (marked joint space narrowing with or without cysts or sclerosis); and (2) ability to walk without any assistive device. The exclusion criteria were as follows: (1) baseline joint space width (JSW) <0.5 mm (a reduction in JSW >0.5 mm was defined as disease progression); (2) previous hip surgery; and (3) other conditions such as orthopedic diseases of joints other than the hip joint or neurological diseases that affect activities of daily living. In patients with bilateral hip OA, the side on which the radiographic OA change was more severe was used as the affected side for analysis. The candidate pool was

sex-biased (males, 7.1%), similar to previous studies¹⁷⁻¹⁹. Only female patients were included in the study due to the difficulty of considering the effect of sex in subsequent analyses. The analysis in this study was performed using the same cohort as in a previous study¹². All participants provided informed consent, and the study protocol was approved by the institutional ethics committee.

Radiographic assessment of hip OA progression and hip morphology

Hip OA progression was assessed by changes in JSW on digital supine anteroposterior pelvic radiographs taken at baseline and 12 months later. A single experienced examiner measured JSW, using Centricity Enterprise Web, version 3.0^a. In addition to blinding the patient's name on the radiograph, the radiographs at baseline and 12 months later were randomly arranged for each patient to blind the sequence, according to blinding radiographs recommendations, to determine the structural progression²⁰. Minimum JSW was defined as the lowest JSW value of the three or four measurements (see Appendix 1)²¹, and radiographic progression of hip OA was defined as JSW reduction >0.5 mm at any of the locations^{20,22}.

Hip morphology, Sharp angle, CE angle, acetabular head index (AHI), and acetabular roof obliquity (ARO) were measured on the same image on which JSW was measured at baseline (see Appendix 1).

Hip muscle strength assessment

Isometric muscle strength for hip flexion, extension, abduction, external rotation, and internal rotation was measured at baseline using a handheld dynamometer^b based on previous studies^{23,24}. These five muscle strengths were selected because they are required to exert muscle force during daily activities²⁵⁻²⁷ and these muscle weaknesses have been shown in patients with hip OA⁷. Hip muscle strength assessment details are reported in Appendix 2. Hip muscle strength balance was expressed as a percentage of the sum of all hip muscle strength values after each muscle strength value was converted to T-value.

88

89 Hip pain and physical function

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91 Hip pain at baseline during daily life was assessed using a 100-mm visual analog scale. Gait speed
92 (meters/second) was measured three times during natural walking at the patient's preferred speed
93 on a 7-m walkway, and the mean value was used. The daily physical activity was recorded using a
94 pedometer^c with validated accuracy^{28,29} for seven consecutive days at baseline, the participants
95 returned their records by mail. The mean value of 7 days was used for subsequent analysis. Harris
96 Hip Score (HHS) was recorded to assess the functional status of the patients with hip OA³⁰. HHS
97 includes pain, function, absence of deformity, and range of motion items and has a maximum of
98 100 points (best possible outcome). In addition, the physical component summary scale and mental
99 component summary scale scores of SF-36 were used as generic measurement tools to assess health
100 status³¹. These scores were calculated as deviation scores (national standard score: 50), with higher
101 scores representing better health. At baseline measurements, participants were instructed to
102 continue with their current lifestyle and physical activity, and when interviewed after 12 months, no
103 significant changes in lifestyle and physical activity were observed in any of the participants.

104

105 Statistical analysis

106

107 Two-step cluster analysis was used to determine the optimum number of clusters. This clustering
108 method has some advantages over more traditional clustering methods, especially in terms of
109 statistically determining the number of clusters based on a predefined criterion, and is a highly
110 reliable solution^{32,33}. Euclidean distance measure was used for distance measurement and Akaike's
111 information criterion was used to identify the optimal number of clusters. The clustering procedure
112 was conducted separately for three datasets: muscle strength variables (cluster analysis 1), muscle
113 strength balance variables (cluster analysis 2), and muscle strength and muscle strength balance
114 variables (cluster analysis 3). The overall goodness of fit of the clustering solution was evaluated
115 using a Silhouette measure. Silhouette measure <0.20 indicated poor solution quality; a measure
116 0.20–0.50, a fair solution; and a measure >0.50, a good solution³².

117

118 To test the stability of the given solution, additional cluster analyses were performed using
119 the following two methods³². First, a two-step cluster analysis was repeated using 10 different
120 datasets with random case order. Second, other clustering procedures –hierarchical agglomerative
121 clustering with Ward’s method and Euclidean distance measure and k-means clustering with
122 Euclidean distance measure– were performed on the same dataset.

123

124 To assess the association between identified phenotypes and the likelihood hip OA
125 progression, univariable logistic regression analysis was performed with radiographic progression
126 (yes/no) as the dependent variable and phenotypes as independent variables. Multivariable logistic
127 regression adjusted for age and minimum JSW at baseline, which can be confounders^{34,35}, was also
128 performed. We performed a series of Student’s *t*-tests on all measurement variables to understand
129 the differences in the profiles of each phenotype. The bootstrap method with 1,000 replicates was
130 employed for logistic regression analysis and comparison of variables between phenotypes. *P* value
131 <0.05 was considered statistically significant. SPSS version 26.0^d and XLSTAT (Microsoft Excel
132 add-in)^e were used for statistical analysis.

133

134

135 **Results**

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137 General profile of the study cohort

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139 The flowchart of this cohort study is shown in Figure 1. Follow-up data were not available for three
140 participants due to scheduling conflicts. The 50 participants’ profiles are listed in Table 1. The ages
141 of the patients ranged from 22 to 65 years. Twenty-one patients (42.0%) demonstrated hip OA
142 progression on radiographic evaluation 12 months later.

143

144 Phenotype identification and profiles of each phenotype

145

Cluster analysis 1

The solution of the cluster analysis 1, which included only the muscle strength variables, showed two phenotypes (phenotypes 1-1 and 1-2). The silhouette coefficient was 0.5, which represented fair solution quality, and was considered acceptable clustering³². As shown in Figure 2, the importance of the variables related to model estimation tended to decrease from external rotation to internal rotation. Repeated cluster analysis of 10 datasets with different case orders and other clustering procedures retained the same solution, thus ensuring the stability of the solution.

In the univariable and multivariable logistic regression analyses, there was no association between the phenotypes and risk of hip OA progression (Table 2). Compared with phenotype 1-2, phenotype 1-1 showed weaker hip muscle strength (Figure 3), higher body mass index (BMI), worse hip pain, slower gait speed, less physical activity, and lower HHS (Table 3); thus, phenotype 1-1 and 1-2 were characterized as “low-function” and “high-function” phenotypes, respectively.

Cluster analysis 2

The patients were classified into two phenotypes (phenotypes 2-1 and 2-2). The silhouette coefficient was 0.5. The solution remained unchanged after 10 additional clustering on 10 datasets with different case orders, and the other clustering procedures also produced a similar solution for the characteristics of the clustering variables in each cluster (hierarchical clustering, size ratio = 1.38 [29/21]; k-means clustering, size ratio = 1.17 [27/23]). Because each phenotype profile and size ratio were similar in other clustering methods, clustering stability was ensured.

The phenotype 2-1 was associated with radiographic progression of hip OA, and the association remained even after adjustment for age and minimum JSW at baseline (Table 2); thus, phenotype 2-1 was characterized as a “high-risk” phenotype for hip OA progression. Phenotype 2-1 showed muscle strength balance with relatively lower hip flexion and internal rotation (Figure 3), as well as stronger hip abduction muscle strength than phenotype 2-2 (Table 3).

Cluster analysis 3

Cluster analysis 3 also presented a solution with two phenotypes (phenotypes 3-1 and 3-2). The silhouette coefficient was 0.3. The relative importance of the variables for model estimation was generally higher for muscle strength variables than that for muscle strength balance variables (Figure 2). In the stability test, 10 additional two-step cluster analyses remained in the same solution. Since the size ratios were slightly different in the other clustering procedures (hierarchical clustering, size ratio = 1.00 [25/25]; k-means clustering, size ratio = 1.63 [31/19]), cluster analysis 3 might be interpreted as slightly less stable than cluster analyses 1 and 2.

No association was found between the phenotypes and the risk of hip OA progression (Table 2). Similar to the results of cluster analysis 1, compared with phenotype 3-2 (high-function phenotype), phenotype 3-1 (low-function phenotype) showed weaker hip muscle strength (Figure 3), higher BMI, worse hip pain, slower gait speed, and lower HHS (Table 3).

Discussion

This study aimed to identify muscle function-based clinical phenotypes in patients with hip OA and to determine their association with the radiographic progression of the disease. Consistent with our hypothesis, we found that a phenotype based on muscle strength balance, rather than muscle strength, was associated with radiographic progression of hip OA over 12 months. This study showed that relative muscle weakness of hip flexion and internal rotation can be a risk factor for hip OA progression.

The data-driven cluster analysis extracted two distinct clinical phenotypes. Although previous studies have investigated the clustering of patients with hip OA based on various variables—such as genes and biochemical markers^{36–39}, systemic predisposition to

204 chondrocalcinosis⁴⁰, proximal femoral canal shape⁴¹, JSW narrowing trajectory⁴², radiographic
205 grade and measures of mental health⁴³, motive profiles⁴⁴, movement behavior⁴⁵, gait kinematics⁴⁶,
206 and comorbid symptoms⁴⁷—the relationship between phenotypes and the risk of hip OA progression
207 has not been investigated. Regarding the relative importance in the cluster analysis (Figure 2),
208 cluster analysis 1 —using muscle strength— and cluster analysis 3 —using both muscle strength and
209 muscle strength balance— presented nearly identical solutions because the classification was mainly
210 based on muscle strength in cluster analysis 3. The patients with hip OA could be divided into the
211 low-function phenotype (phenotypes 1-1 and 3-1) and the high-function phenotype (phenotypes 1-2
212 and 3-2). The “low-function” phenotype had lower general hip muscle strength with higher BMI
213 and worse hip pain, resulting in less physical function. These findings support the reported
214 heterogeneity of muscle function in patients with hip OA⁷. More importantly, clustering based on
215 muscle strength balance (cluster analysis 2) identified a high-risk phenotype (phenotype 2-1)
216 associated with hip OA progression although the confidence interval was wide and its lower bound
217 was close to 1, suggesting a weak association. This finding indicates that impaired muscle strength
218 balance is more important than overall and homogeneous muscle weakness in the context of the
219 risk of hip OA progression. The high-risk phenotype in cluster analysis 2, which had relatively
220 weaker hip flexion and internal rotation and relatively stronger hip extension and abduction, was
221 more likely to develop hip OA than phenotype 2-2 with an odds ratio of 3.60. Since the relative
222 changes in individual hip muscle strength can have a significant impact on changes in the
223 magnitude and direction of hip contact force^{10,11}, consideration of hip muscle strength balance is
224 important in assessing the risk of and preventing hip OA progression.

225

226 The association between high-risk phenotype (phenotype 2-1) with muscle strength
227 imbalance and radiographic progression of hip OA may be due to the structural features of the hip
228 joint and the microinstability’s direction. The anterior hip joint has a smaller coverage with the
229 acetabulum than the posterior, and displacement of the femoral head tends to increase anteriorly
230 and inferiorly, as in acetabular dysplasia and tears of labrum and capsular ligament^{48–50}.
231 Musculoskeletal modeling simulation has revealed that a reduced force of the iliopsoas muscle,
232 which is a main hip flexor, increases the anterior and resultant hip contact force during hip flexion⁵¹.

Furthermore, the combined role of static and dynamic stabilizers, that is, joint stabilization through adhesion between the muscle and capsular ligament, has been presumed⁵². The anterior part of the gluteus minimus, iliocapsularis, and reflected head of the rectus femoris partially adhere to the capsular ligament, and this unique structure may contribute to anterior hip stabilization by increasing the tension of the anterior capsular ligament due to contraction of these muscles⁵². Their muscle weakness and the associated muscle imbalance around the hip joint may result in inadequate functioning of the stabilization mechanisms, and subsequently, progression of hip OA. Isometric muscle strength, which was measured in this study, is the most clinically available measure of muscle function. Based on our results, larger, longer-term longitudinal and intervention studies, are needed to clarify the relationship between muscle function and disease progression in patients with hip OA. Subsequently, this evidence may contribute to prevention of disease progression.

Study limitations

Several limitations should be considered. The small number of participants, consisting only of female patients with mild to moderate hip OA who are relatively well functioning, could limit the generalizability of our findings. The muscle strength measured was the sum of the exerted forces of some muscles; therefore, the muscle force of each muscle was not measured. Some specific hip muscles, such as the gluteus minimum, have been reported to be atrophied in unilateral hip OA; however, there is also heterogeneity in the changes in individual muscle sizes⁵³. Further research is required to investigate the relationship between individual muscle forces and hip OA progression. Muscle strength was measured using isometric contraction. Different clustering solutions can be obtained using muscle strength values obtained by concentric or eccentric contraction. However, such differences in measurement protocols may not have a discernible effect on the findings⁷. Isometric muscle strength is easily assessable in clinical settings; thus, the findings of this study will be useful for clinicians to develop strategies for the prevention of hip OA progression. We calculated the odds ratio in the logistic regression analysis; however, odds ratio can under- or overestimate the relative risk if the modeled event is not rare⁵⁴. Finally, a relatively

262 short follow-up duration was employed, although the 12-month follow-up met the minimum
263 requirements for generating valid and informative prognostic variables for hip OA⁵⁵. A longer
264 follow-up may establish a stronger relationship between hip muscle function and hip OA
265 progression.

266

267

268 **Conclusions**

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270 The cluster analysis 1 and 3, which included only hip muscle strength and hip muscle strength and
271 muscle strength balance, respectively, classified low-function and high-function phenotypes.
272 Moreover, as preliminary findings, we identified a high-risk phenotype associated with
273 radiographic progression of hip OA in cluster analysis 2, which based on muscle strength balance
274 alone. The high-risk phenotype had relatively weaker hip flexion and internal rotation and
275 relatively greater hip extension and abduction than the other phenotype. Hip muscle strength
276 balance should therefore be considered in clinical evaluation and treatment strategy development
277 for the prevention of hip OA progression.

278 (2997 words)

279

280

281 **Suppliers:**

282 a, GE Health care, Nightingales Lane, Chalfont Street Giles, Buckinghamshire, HP8 4SP, England

283 b, μ -TAS F-1, Anima Co., Ltd, Tokyo, Japan

284 c, EX-500, Yamasa Tokei Co., Ltd, 2-4-9, Kaminoge, Setagaya-ku, Tokyo, Japan

285 d, IBM Japan Ltd, 19-21, Nihonbashi, Hakozaiki-cho, Chuo-ku, Tokyo, Japan

286 e, Mindware Inc, 1-4, Ekimotomachi, Kita-ku, Okayama, Japan

287

288

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290

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465 **Figure legends**

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468 **Fig 1 Flowchart of participants in cohort study**

469 Data from 50 participants were analyzed in this study.

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472 **Fig 2 Relative importance of predictors in clustering**

473 This graph shows the relative importance of each variable in each cluster analysis, which is a
474 measure of the importance of the contribution of each attribute in estimating the cluster. Hip muscle
475 strength balance was calculated as the percentage of each muscle strength to the total T-valued
476 muscle strength.

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479 **Fig 3 Muscle function profiles of each phenotype**

480 Radar charts represent the differences in muscle strength and muscle strength balance between
481 phenotypes. Muscle strength was plotted using T-score. Cluster analyses 1, 2, and 3 included
482 muscle strength variables, muscle strength balance variables, and both muscle strength and muscle
483 strength balance variables, respectively.

Table 1 Demographic, radiographic, physical, and hip function characteristics of the participants

All patients (n = 50)	
Age, years	47.4 ± 10.7
Body mass index	22.4 ± 4.1
Radiographic	
Progression of hip OA, n (%)	Progressors, 21 (42.0%) Non-progressors, 29 (58.0%)
Minimum JSW, mm	3.33 ± 1.44
Sharp angle, degrees	45.0 ± 6.5
CE angle, degrees	23.4 ± 11.5
AHI, degrees	73.8 ± 11.0
ARO, degrees	22.4 ± 7.9
Pain (VAS), mm	42.0 ± 27.5
Gait speed, m/sec.	1.1 ± 0.2
Physical activity, steps	6,596 ± 2,551
Harris Hip Score	86.9 ± 9.9
SF-36	
PCS	49.4 ± 8.6
MCS	48.4 ± 11.8
Muscle strength, Nm/kg	
Flexion	0.87 ± 0.25
Extension	1.46 ± 0.57
Abduction	0.75 ± 0.21
External rotation	0.36 ± 0.12
Internal rotation	0.32 ± 0.12

(Footnotes for Table 1)

Values are mean ± standard deviation.

Abbreviations: JSW, joint space width; CE center edge; AHI, acetabular head index; ARO, acetabular roof obliquity; VAS, visual analogue scale; PCS, physical component summary scale score; MCS, mental component summary scale score.

Table 2 Univariable and multivariable logistic regression exploring the association between phenotypes and likelihood of progression of hip osteoarthritis

	No progression, n	Progression, n	Total, n	Crude OR (95% CI)	<i>p</i>	Adjusted OR* (95% CI)	<i>p</i>
Cluster analysis 1 (Muscle strength)							
Phenotype 1	16	15	31	2.03 (0.61–6.72)	0.241	2.18 (0.64–7.40)	0.227
Phenotype 2	13	6	19				
Total	29	21	50				
Cluster analysis 2 (Muscle strength balance)							
Phenotype 1	12	15	27	3.54 (1.07–11.77)	0.025	3.60 (1.07–12.05)	0.039
Phenotype 2	17	6	23				
Total	29	21	50				
Cluster analysis 3 (Muscle strength + Muscle strength balance)							
Phenotype 1	14	12	26	1.43 (0.46–4.42)	0.534	1.44 (0.46–4.49)	0.563
Phenotype 2	15	9	24				
Total	29	21	50				

(Footnotes for Table 2)

Reference group is phenotype 2 in all cluster analyses.

Bold of *P* value indicates statistically significant.

Abbreviations: OR, odds ratio; 95% CI, 95% confidence interval

* Adjusted for age and minimum joint space width at baseline.

Table 3 Profile of phenotypes for each of the three-cluster analyses

	Cluster analysis 1 (Muscle strength)				Cluster analysis 2 (Muscle strength balance)				Cluster analysis 3 (Muscle strength + muscle strength balance)			
	Phenotype 1 (n = 31)	Phenotype 2 (n = 19)	<i>p</i> * (95% CI)	<i>d</i> †	Phenotype 1 (n = 27)	Phenotype 2 (n = 23)	<i>p</i> * (95% CI)	<i>d</i> †	Phenotype 1 (n = 26)	Phenotype 2 (n = 24)	<i>p</i> * (95% CI)	<i>d</i> †
Age, years	46.6 ± 9.4	48.1 ± 12.9	0.661 (-8.03, 5.77)	0.14	47.3 ± 12.3	47.0 ± 8.6	0.926 (-5.66, 6.59)	0.03	47.5 ± 8.9	46.8 ± 12.6	0.835 (-6.01, 6.64)	0.06
Body mass index	23.8 ± 4.3	20.1 ± 2.6	< 0.001 (1.89, 5.62)	0.99	22.6 ± 4.2	22.3 ± 4.2	0.802 (-2.13, 2.66)	0.07	24.6 ± 4.3	20.1 ± 2.4	< 0.001 (2.56, 6.37)	1.28
Radiographic												
Minimum JSW, mm	3.15 ± 1.52	3.51 ± 1.21	0.355 (-1.13, 4.22)	0.26	3.08 ± 1.43	3.55 ± 1.38	0.253 (-1.26, 0.40)	0.33	3.04 ± 1.61	3.55 ± 1.14	0.198 (-1.27, 0.27)	0.36
Sharp angle, degrees	45.5 ± 7.2	43.9 ± 5.5	0.419 (-1.95, 5.36)	0.24	44.4 ± 6.1	45.6 ± 7.2	0.539 (-5.08, 2.72)	0.18	45.0 ± 7.3	44.8 ± 5.9	0.923 (-3.48, 4.08)	0.03
CE angle, degrees	22.0 ± 11.9	25.9 ± 10.7	0.259 (-10.78, 2.59)	0.34	24.5 ± 12.7	22.1 ± 9.9	0.469 (-4.27, 8.60)	0.21	21.7 ± 11.8	25.3 ± 11.2	0.272 (-10.10, 3.15)	0.31
AHI, degrees	72.7 ± 10.8	75.6 ± 11.8	0.388 (-9.41, 4.01)	0.26	74.0 ± 11.8	73.5 ± 10.4	0.875 (-5.90, 7.22)	0.04	72.5 ± 10.9	75.2 ± 11.5	0.387 (-8.96, 3.32)	0.24
ARO, degrees	23.1 ± 6.9	20.8 ± 9.6	0.371 (-2.52, 7.32)	0.29	22.5 ± 8.6	22.0 ± 7.3	0.827 (-4.03, 5.19)	0.06	23.5 ± 6.1	20.9 ± 9.6	0.294 (-1.84, 7.25)	0.33
Pain (VAS), mm	50.2 ± 26.3	30.0 ± 25.6	0.014 (4.95, 35.56)	0.78	43.5 ± 26.9	41.2 ± 29.3	0.781 (-14.69, 18.71)	0.08	51.4 ± 27.6	32.8 ± 25.0	0.018 (4.36, 32.02)	0.70
Gait speed, m/sec.	1.09 ± 0.16	1.21 ± 0.14	0.006 (-0.22, -0.04)	0.79	1.16 ± 0.15	1.10 ± 0.18	0.202 (-0.03, 0.16)	0.36	1.07 ± 0.16	1.21 ± 0.15	0.002 (-0.22, -0.06)	0.90
Physical activity, steps	5,937 ± 2,374	7,557 ± 2,688	0.044 (-3167.29, -90.93)	0.65	6,528 ± 2,498	6,566 ± 2,771	0.960 (-1496.85, 1409.42)	0.01	5,853 ± 2,499	7,296 ± 2,531	0.053 (-2891.14, -39.01)	0.57
Harris Hip Score	83.6 ± 10.5	91.4 ± 6.5	0.003 (-13.06, -3.61)	0.85	86.7 ± 11.0	86.7 ± 8.8	0.980 (-5.57, 5.19)	0.00	82.4 ± 10.1	91.4 ± 7.7	0.001 (-13.92, -4.01)	1.00
SF-36												
PCS	35.5 ± 11.9	40.0 ± 8.3	0.140 (-9.97, 1.33)	0.42	37.1 ± 11.7	37.3 ± 9.9	0.941 (-6.12, 6.33)	0.02	35.0 ± 12.9	39.6 ± 7.7	0.137 (-10.27, 1.31)	0.43
MCS	50.5 ± 8.3	47.4 ± 9.2	0.266 (-2.05, 8.68)	0.36	49.3 ± 6.7	49.3 ± 10.9	0.990 (-5.18, 5.38)	0.00	50.2 ± 8.7	48.4 ± 8.7	0.475 (-3.27, 6.79)	0.21
Muscle strength, Nm/kg												
Flexion	0.73 ± 0.15	1.10 ± 0.23	< 0.001 (-0.49, -0.26)	2.01	0.83 ± 0.27	0.92 ± 0.24	0.228 (-0.24, 0.05)	0.35	0.69 ± 0.13	1.07 ± 0.21	< 0.001 (-0.48, -0.28)	2.20
Extension	1.13 ± 0.32	2.04 ± 0.48	< 0.001 (-1.18, -0.66)	2.35	1.61 ± 0.61	1.29 ± 0.50	0.058 (0.00, 0.62)	0.57	1.05 ± 0.28	1.93 ± 0.47	< 0.001 (-1.11, -0.68)	2.30

Abduction	0.63 ± 0.14	0.95 ± 0.18	< 0.001 (-0.41, -0.22)	2.05	0.82 ± 0.23	0.67 ± 0.17	0.021 (0.02, 0.26)	0.73	0.60 ± 0.11	0.92 ± 0.17	< 0.001 (-0.40, -0.24)	2.25
External rotation	0.28 ± 0.07	0.49 ± 0.09	< 0.001 (-0.25, -0.16)	2.69	0.35 ± 0.12	0.38 ± 0.13	0.431 (-0.10, 0.04)	0.24	0.29 ± 0.07	0.44 ± 0.12	< 0.001 (-0.22, -0.10)	1.54
Internal rotation	0.26 ± 0.07	0.42 ± 0.12	< 0.001 (-0.23, -0.10)	1.74	0.30 ± 0.11	0.35 ± 0.13	0.150 (-0.12, 0.01)	0.42	0.25 ± 0.07	0.40 ± 0.12	< 0.001 (-0.20, -0.09)	1.54
Muscle strength balance††, %												
Flexion	20.1 ± 2.0	19.9 ± 2.1	0.760 (-1.03, 1.37)	0.10	19.3 ± 1.9	20.9 ± 1.7	0.003 (-2.75, -0.56)	0.88	19.9 ± 2.1	20.2 ± 1.9	0.605 (-1.39, 0.84)	0.15
Extension	20.0 ± 1.5	20.2 ± 1.8	0.577 (-1.23, 0.67)	0.12	21.0 ± 1.3	18.9 ± 1.1	< 0.001 (1.39, 2.73)	1.73	19.8 ± 1.6	20.3 ± 1.6	0.260 (-1.40, 0.34)	0.31
Abduction	20.0 ± 2.0	20.0 ± 2.6	0.946 (-1.39, 1.35)	0.00	21.1 ± 2.0	18.6 ± 1.6	< 0.001 (1.51, 3.50)	1.37	19.8 ± 2.0	20.3 ± 2.4	0.422 (-1.77, 0.78)	0.23
External rotation	20.0 ± 2.3	20.3 ± 1.8	0.341 (-1.63, 0.57)	0.14	19.5 ± 2.2	20.6 ± 1.8	0.092 (-2.14, 0.20)	0.54	20.3 ± 2.1	19.7 ± 2.1	0.344 (-0.64, 1.81)	0.29
Internal rotation	20.2 ± 1.6	19.5 ± 2.0	0.231 (-0.42, 1.80)	0.40	19.1 ± 1.5	21.0 ± 1.6	< 0.001 (-2.76, -1.07)	1.23	20.3 ± 1.7	19.6 ± 1.8	0.139 (-0.22, 1.73)	0.40

(Footnotes for Table 3)

Values are mean ± standard deviation. Bold indicates statistically significant.

Abbreviations: JSW, joint space width; CE center edge; AHI, acetabular head index; ARO, acetabular roof obliquity; VAS, visual analogue scale; PCS, physical component summary scale score; MCS, mental component summary scale score; CI, confidence interval.

* Independent-sample *t* test.

† Cohen's *d*.

†† Percentage of each muscle strength value converted into T-score.

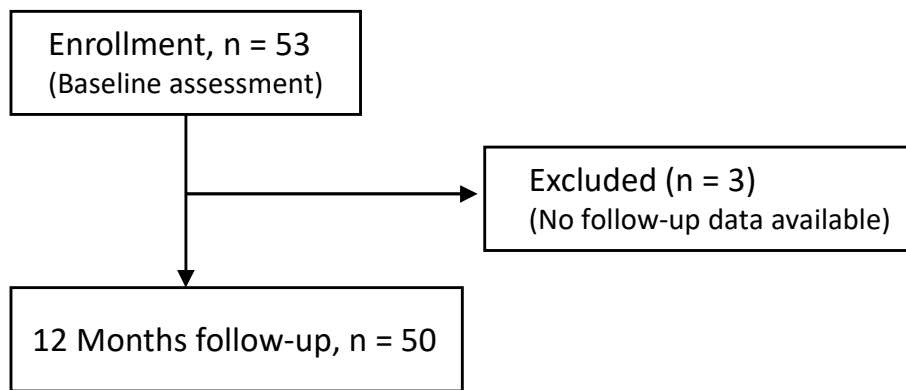
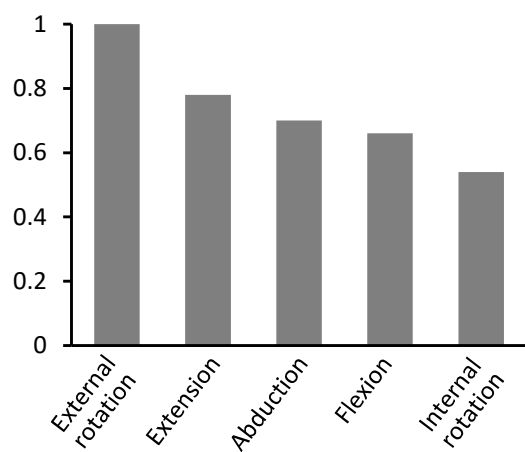
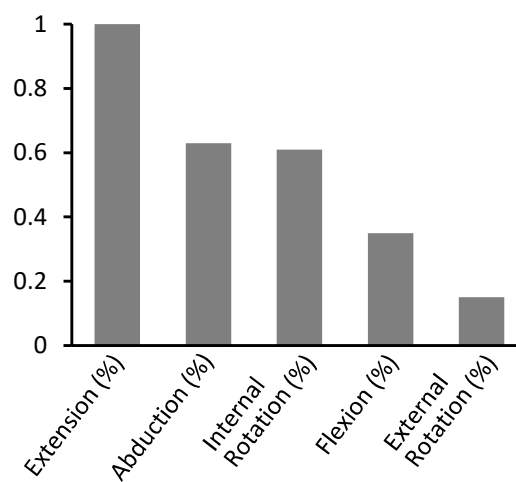


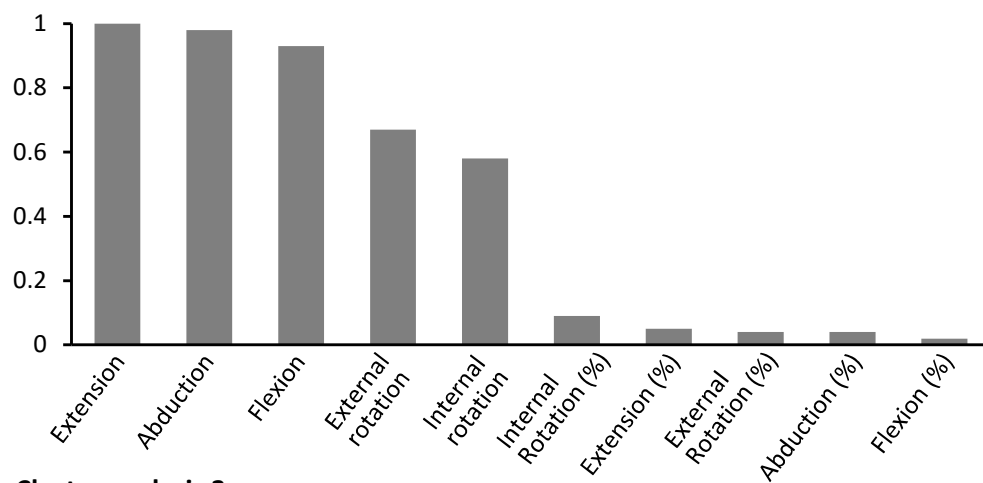
Fig 1



Cluster analysis 1



Cluster analysis 2



Cluster analysis 3

Fig 2

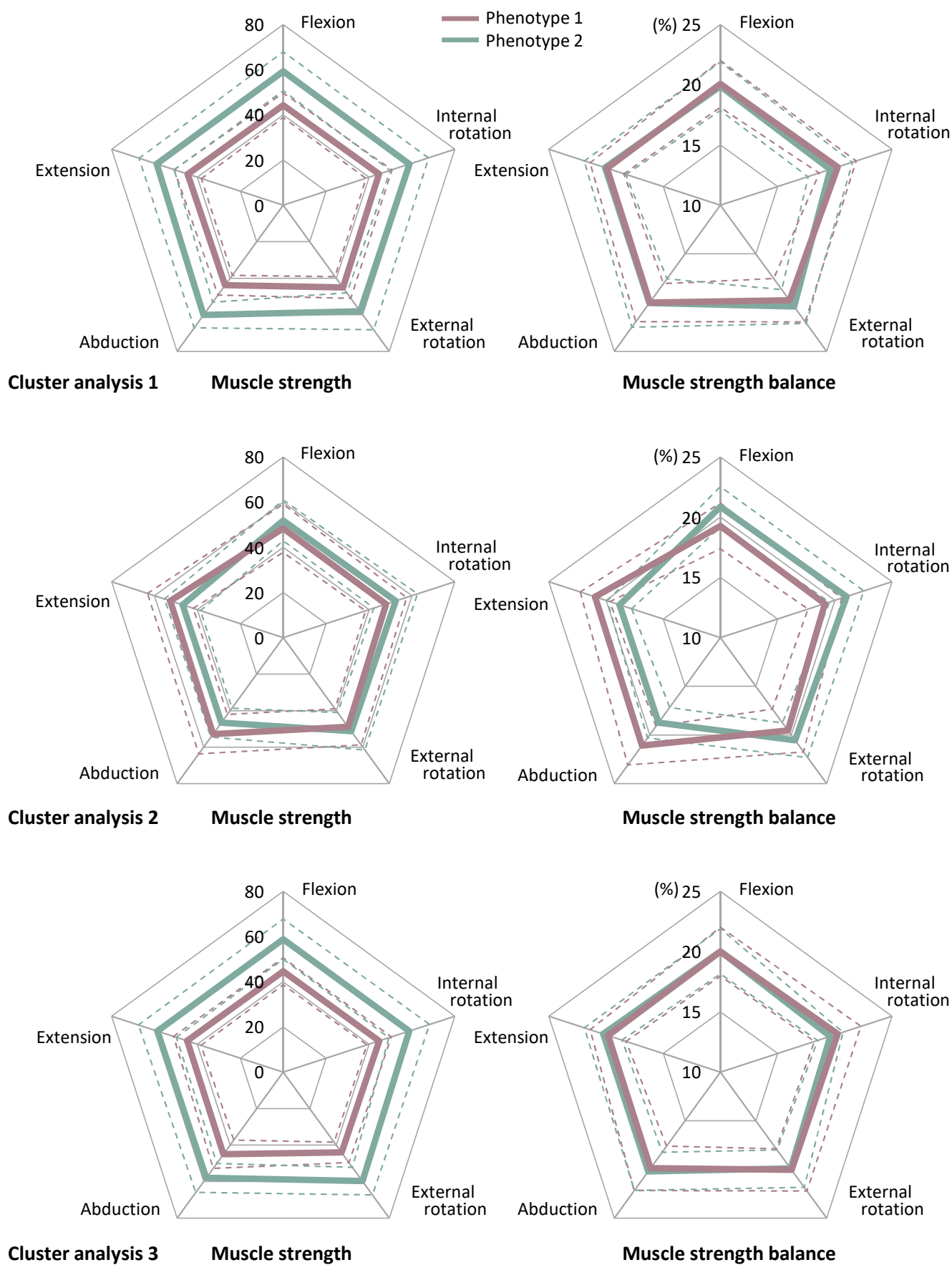


Fig 3