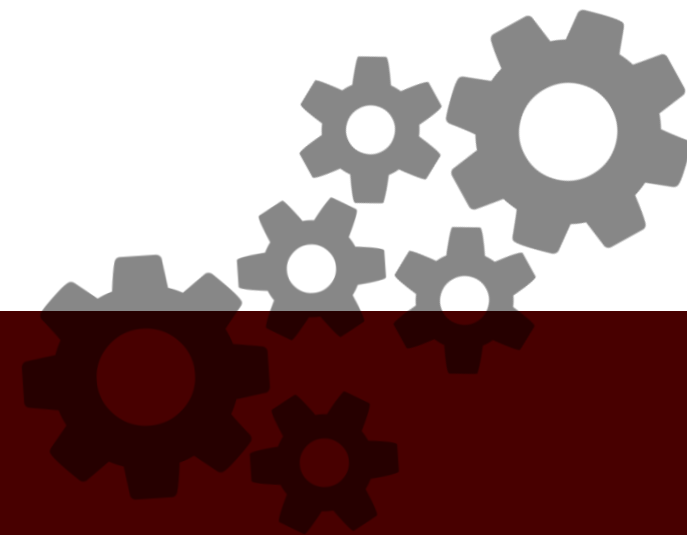


A Phase-Shifting Based Human Gait Phase Estimation for Powered Transfemoral Prostheses

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Introduction : Prosthesis control



Impedance based Control

- impedance based control
 - : modulate many impedance parameters
 - : but more comfortable for users



Tracking based Control

- Tracking-based control
 - : use parameterized variable
 - : But user have to follow pre-defined move

Introduction : Hybrid control

*Phase Variable Estimation

: 사용자가 어떤 phase에 있는지 로봇이 알고 그에 맞는 제어, 보행 궤적을 제공해야한다.

Impedance
based
Control

Hybrid
Control

Tracking
based
Control

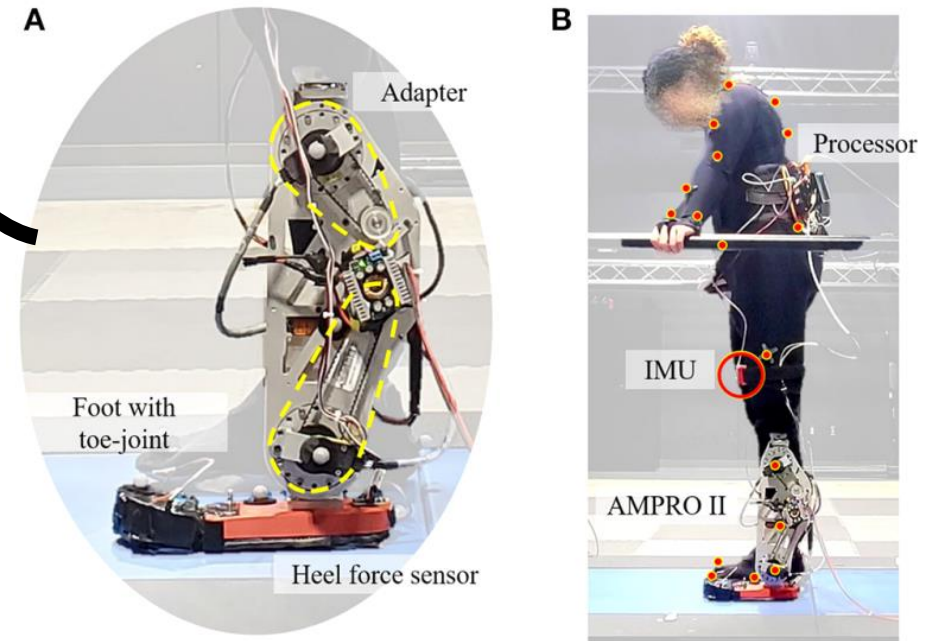
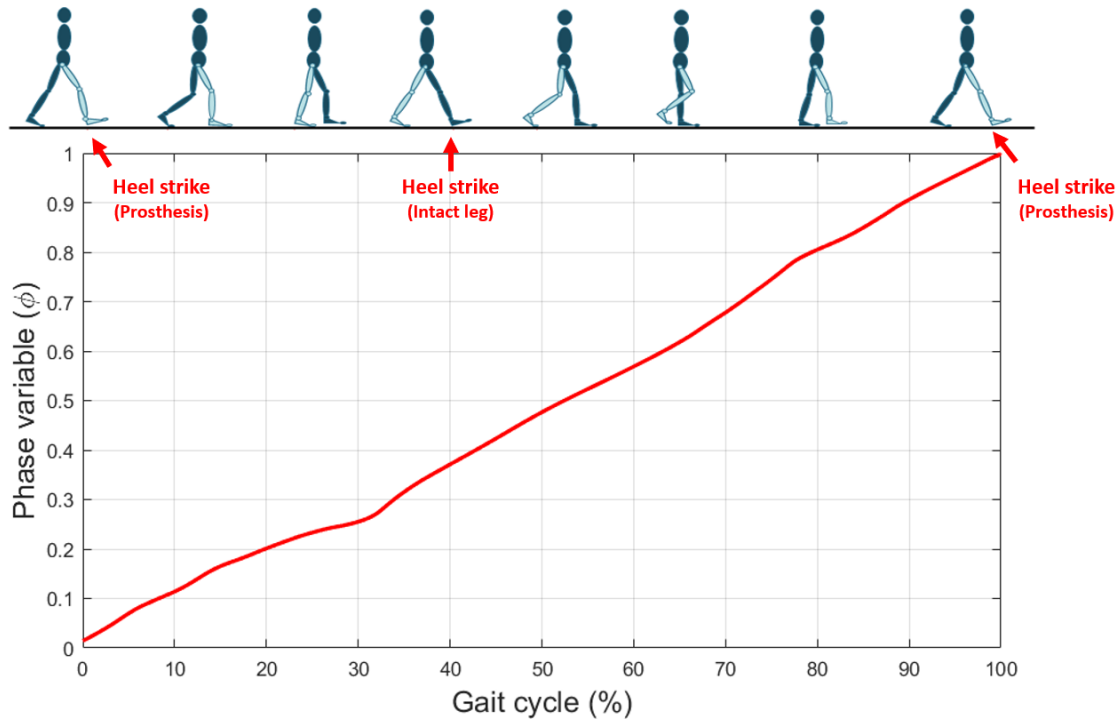


Figure 1. (A) Powered Transfemoral Prosthesis (AMPRO II), (B) Amputee Walking with AMPRO II

Introduction : Phase Variable

Gait Phase Estimation



보행 추정에 자주 쓰이는 상태 변수

Linearized
Hip
Position

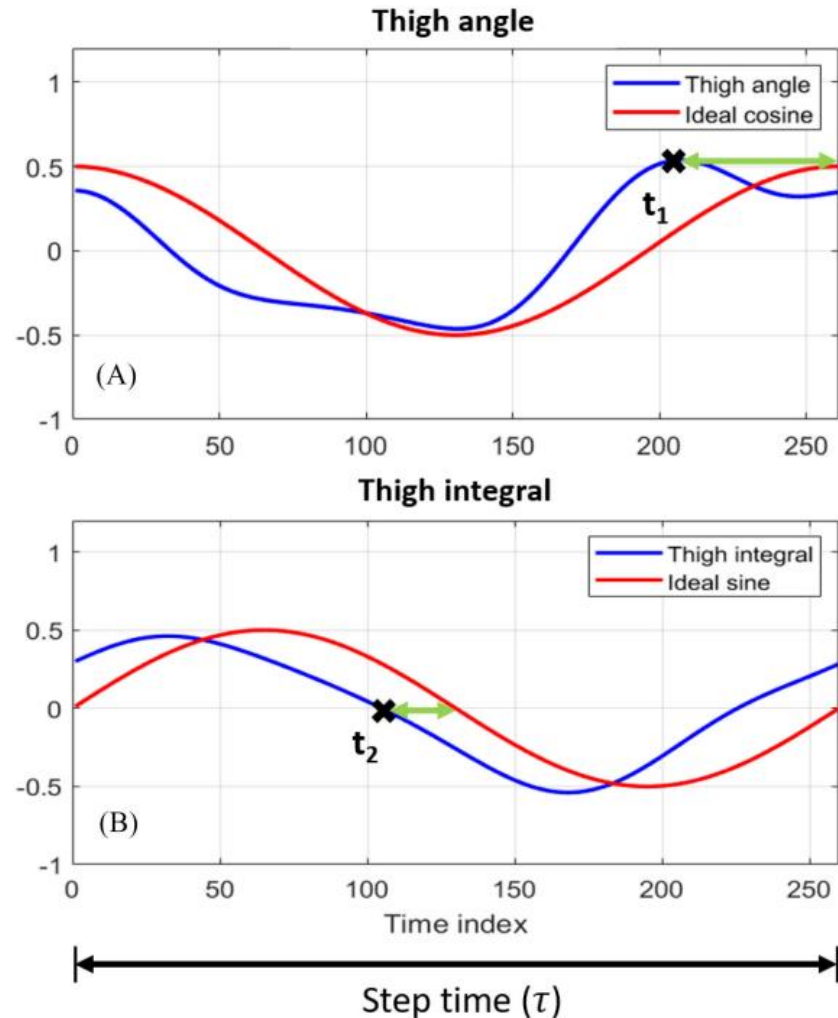
Tibia
Angle

Thigh
Angle

*Phase Variable Qualification

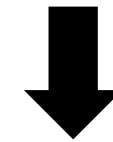
- i) monotonic, bounded on $[0, 1]$
- ii) purely controlled by user

Introduction : Contribution



Assumption

$$\text{Thigh Angle} \approx \text{Cosine Function}$$



오차

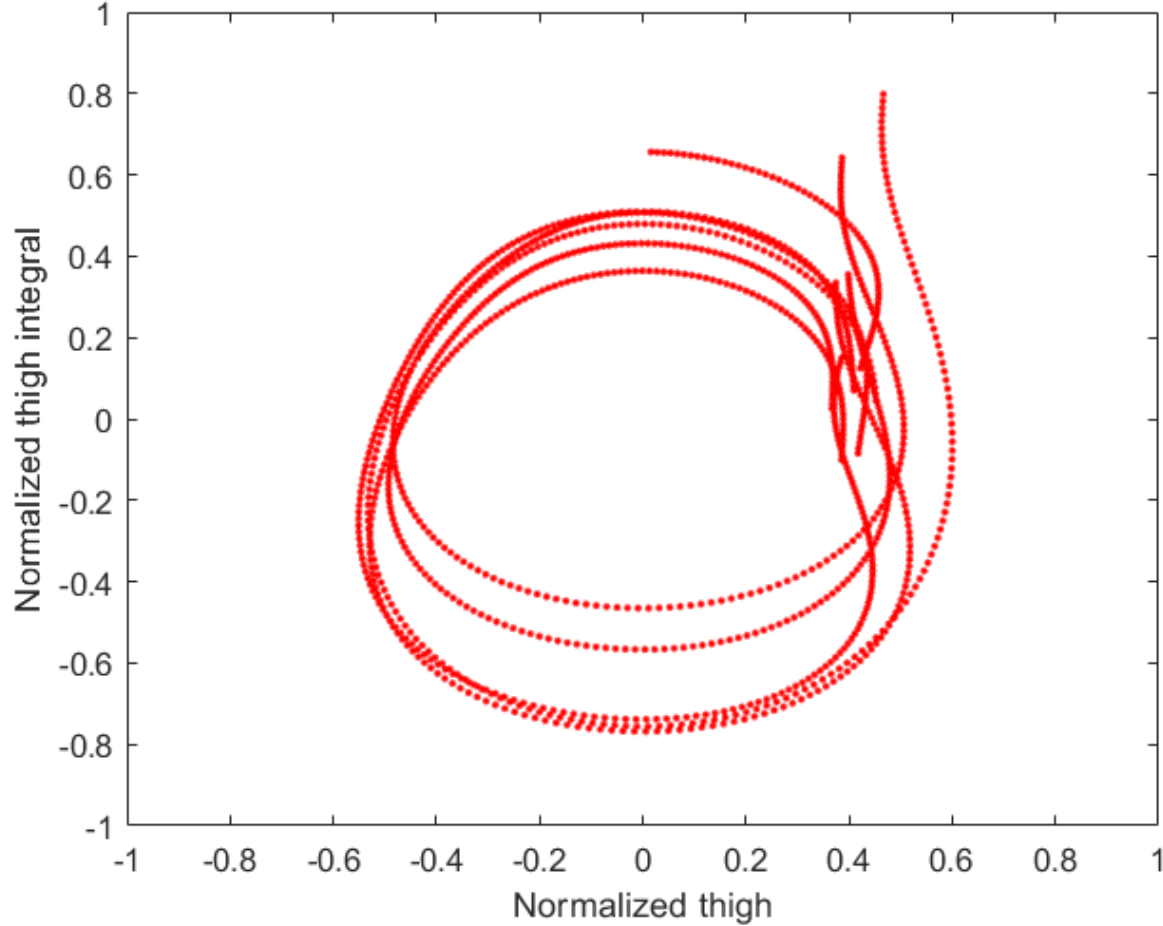
문제 발생 (HS detection)
하지만 아직 연구가 되어 있지 않음

Introduction : Hypothesis

Hypthesis

- ① 허벅지 각도를 위상 변화 시키면 코사인 함수에 더 가까워진다
- ② 허벅지각 적분 함수를 위상 변화 시키면 싸인 함수에 더 가까워진다
- ③ 위상 변화를 하면 위상 변수의 선형성이 증가한다
- ④ 위상 변화를 하면 Heel Strike를 더 정확히 예측한다

Preliminaries



Parameters

$$\Phi(t) = \frac{1}{2\pi} \text{atan} 2(k(\Theta(t) - \alpha), (\theta(t) - \beta))$$

$$k = \frac{|\theta_{max} - \theta_{min}|}{|\Theta_{max} - \Theta_{min}|}$$

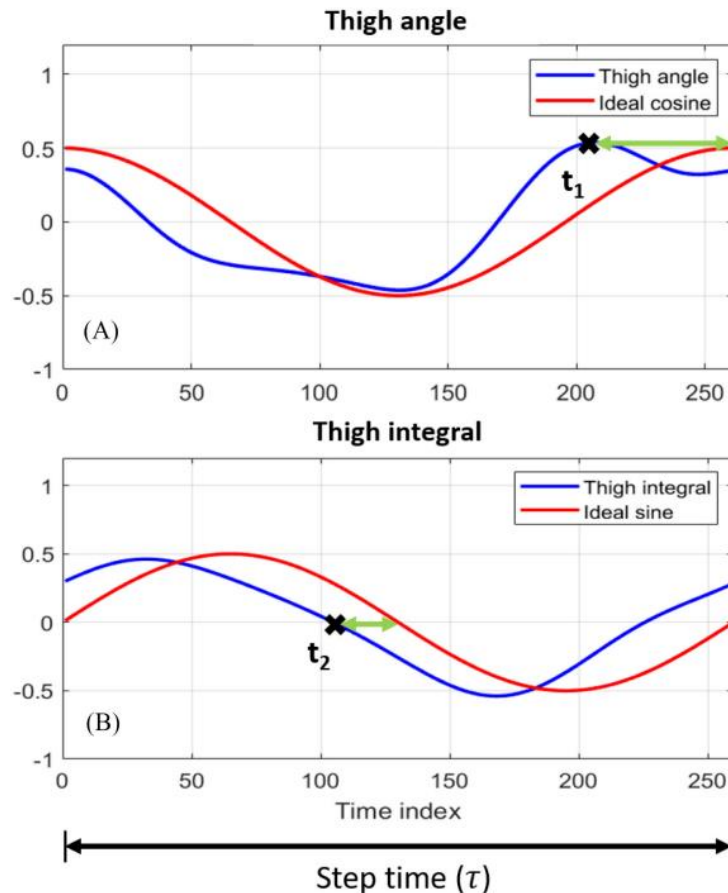
$$\alpha = \frac{|\Theta_{max} - \Theta_{min}|}{2}$$

$$\beta = \frac{|\theta_{max} - \theta_{min}|}{2}$$

$$\Phi(t) = \begin{cases} \Phi(t) & \text{for } \Phi(t) \geq 0 \\ \Phi(t) + 1 & \text{for } \Phi(t) < 0 \end{cases}$$

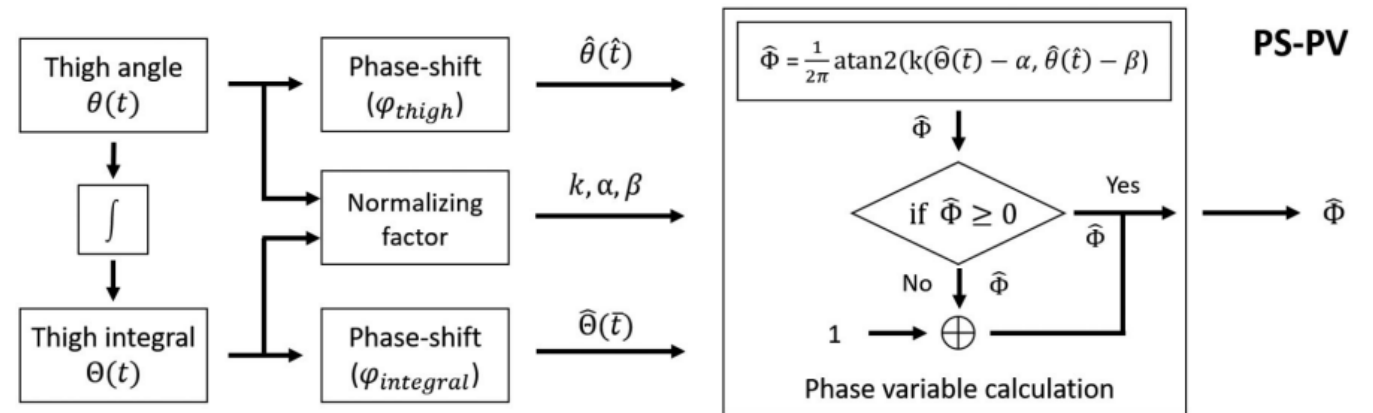
Methods

Cross Correlation : 이상적인 삼각 함수 피팅을 위한 최적의 위상 변화를 구함



$$\hat{\theta}(\hat{t}) = \theta(t + \varphi_{thigh})$$

$$\hat{\Theta}(\bar{t}) = \Theta(t + \varphi_{integral})$$



Experiment



Healthy
Walking
Analysis

Amputee
Walking
Analysis

Real time
Implementation

Experiment and Results : Healthy Walking

Table1. THE MEAN AND A STANDARD DEVIATION OF THE FOUR METRICS ACROSS 50 CONSECUTIVE STEPS FOR THREE SUBJECTS

**Cross correlation
vs. ideal sinusoidal**

**RMS Error
vs. linear function**

**Error
vs. ideal peak (HS)**

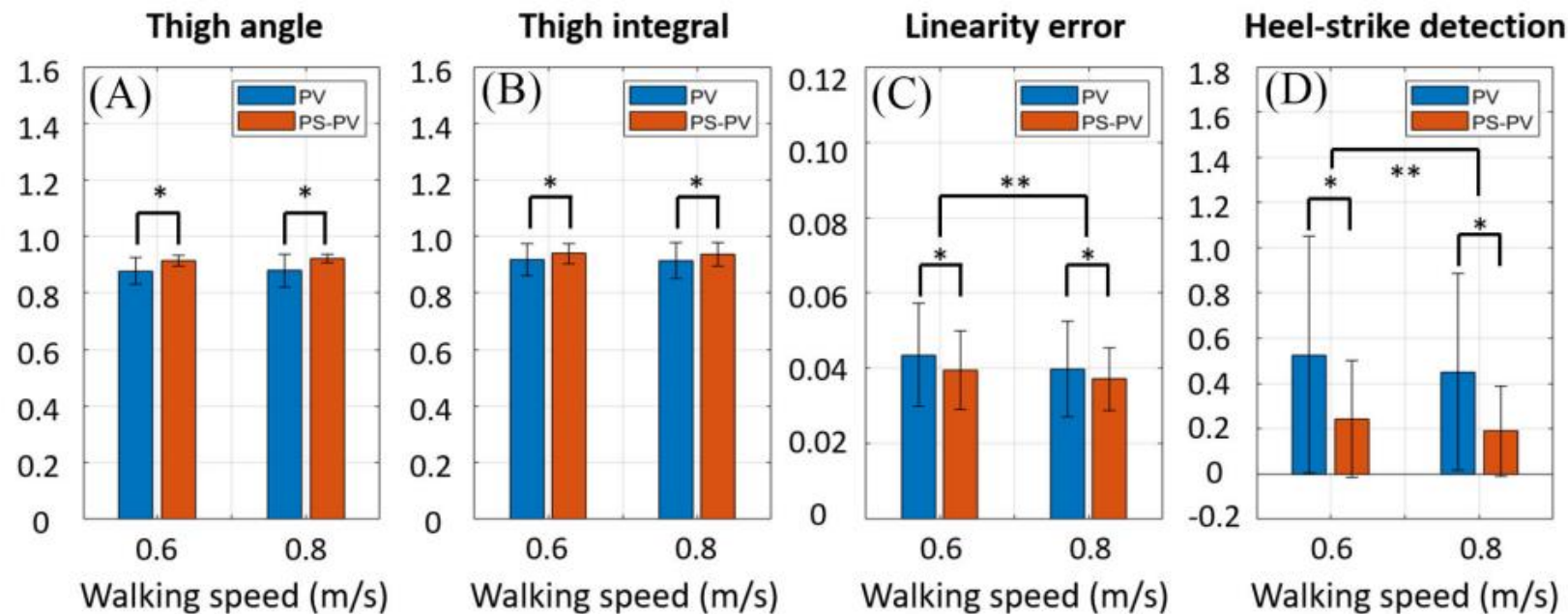
	Speed (m/s)	PV	PS-PV
Thigh angle correlation	0.5	0.862 ± 0.033	0.913 ± 0.014
	1.0	0.859 ± 0.037	0.935 ± 0.011
	1.5	0.783 ± 0.035	0.950 ± 0.008
	2.0	0.700 ± 0.036	0.949 ± 0.008
Thigh integral correlation	0.5	0.894 ± 0.036	0.988 ± 0.003
	1.0	0.876 ± 0.038	0.994 ± 0.002
	1.5	0.801 ± 0.035	0.993 ± 0.002
	2.0	0.720 ± 0.037	0.990 ± 0.002
Linearity error	0.5	0.040 ± 0.009	0.035 ± 0.007
	1.0	0.029 ± 0.006	0.024 ± 0.005
	1.5	0.025 ± 0.005	0.028 ± 0.007
	2.0	0.044 ± 0.007	0.046 ± 0.005
Heel-strike detection error	0.5	0.793 ± 0.760	0.736 ± 0.350
	1.0	0.706 ± 0.719	0.540 ± 0.272
	1.5	1.073 ± 0.949	0.667 ± 0.264
	2.0	2.063 ± 2.188	1.642 ± 0.411

Experiment and Results : Amputee Walking

University of Utah public biomechanics dataset :

K2(한정적인 보행) - 0.4,0.5,**0.6**,0.7,**0.8** m/s

K3(자립보행 가능) - **0.6**,**0.8**,1.0,1.2,1.4 m/s



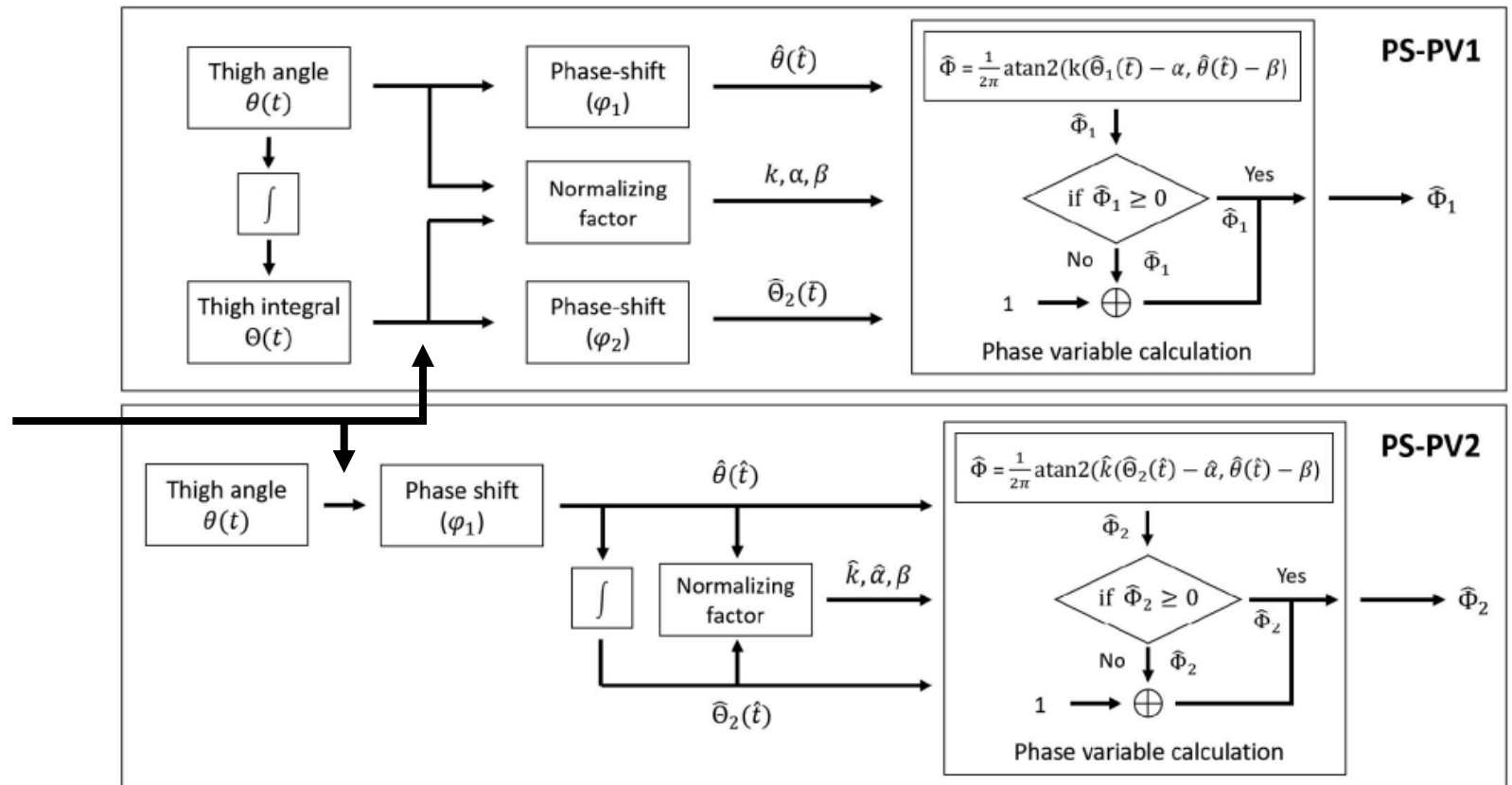
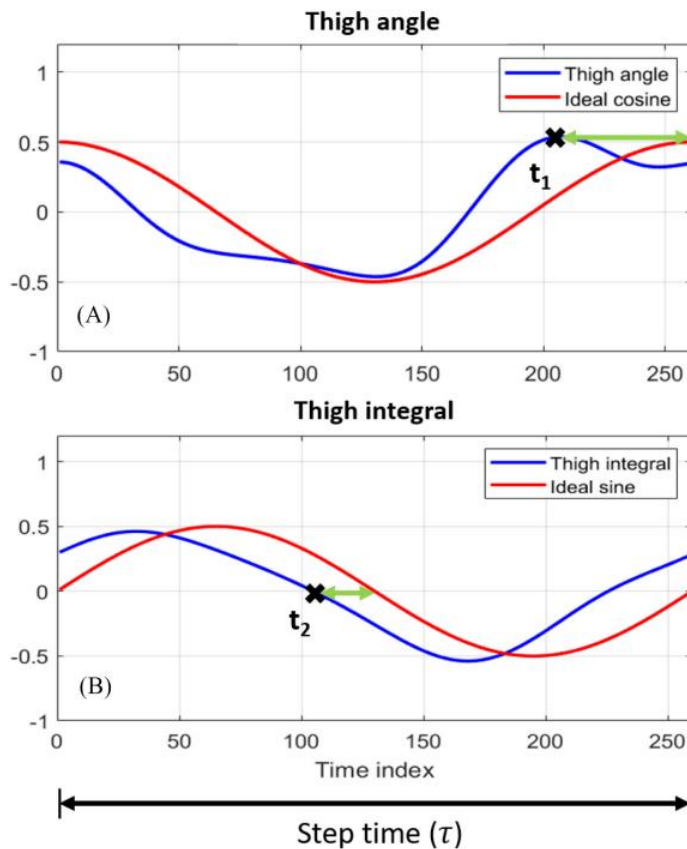
Three way Mixed ANOVA:
group, walking speed, method

Experiment and Results :

Real-Time Phase Shifting Implementation

의족 가동 중 실시간 위상 지연 감지 필요

$$\varphi_1 = \tau - t_1, \quad \varphi_2 = \frac{1}{2}\tau - t_2$$



Real-Time Phase Shifting Implementation

$$\hat{\theta}(\hat{t}) = \theta(t + \varphi_1)$$

$$\hat{\Phi}_1(t) = \frac{1}{2\pi} \text{atan2}(k(\hat{\Theta}_1(\bar{t}) - \alpha), (\hat{\theta}(\hat{t}) - \beta))$$

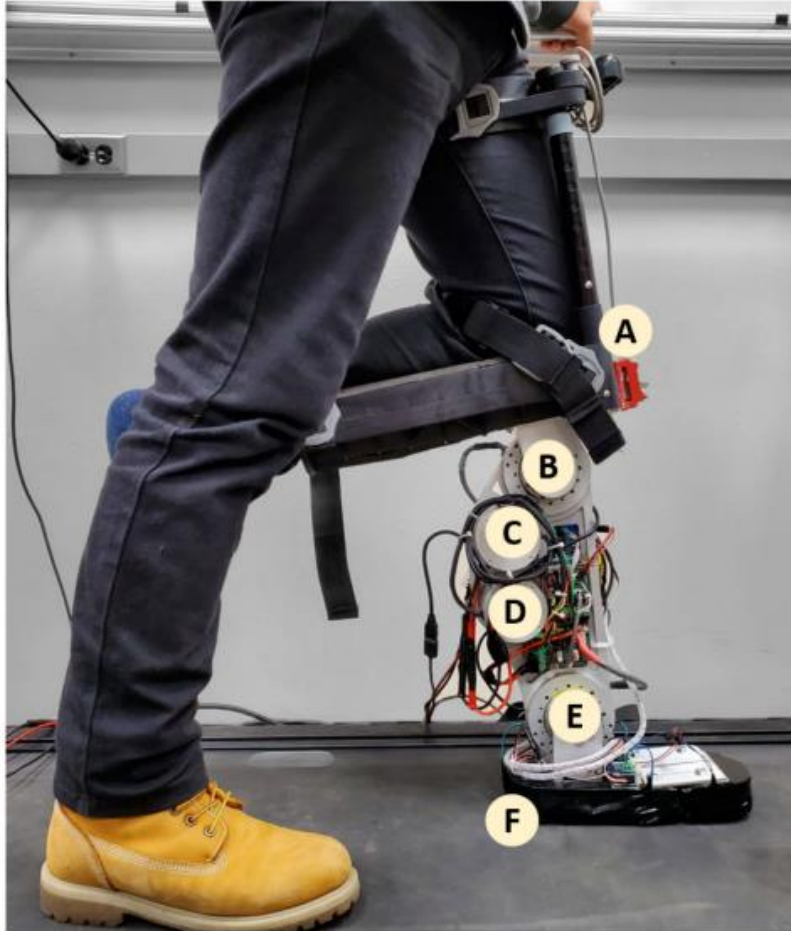
$$\hat{\Theta}_1(\bar{t}) = \Theta(t + \varphi_2)$$

$$\hat{\Phi}_2(t) = \frac{1}{2\pi} \text{atan2}(\hat{k}(\hat{\Theta}_2(\hat{t}) - \hat{\alpha}), (\hat{\theta}(\hat{t}) - \beta))$$

$$\hat{\Theta}_2(\hat{t}) = \int \hat{\theta}(\hat{t}) d\hat{t}$$

$$\hat{k} = \frac{|\hat{\theta}_{max} - \hat{\theta}_{min}|}{|\hat{\Theta}_{2,max} - \hat{\Theta}_{2,min}|}, \quad \hat{\alpha} = \frac{|\hat{\Theta}_{2,max} + \hat{\Theta}_{2,min}|}{2}$$

Real-Time Phase Shifting Implementation

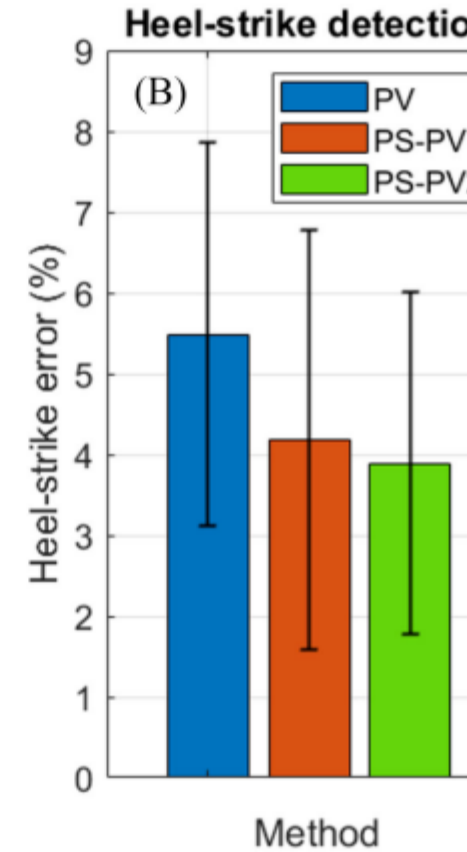
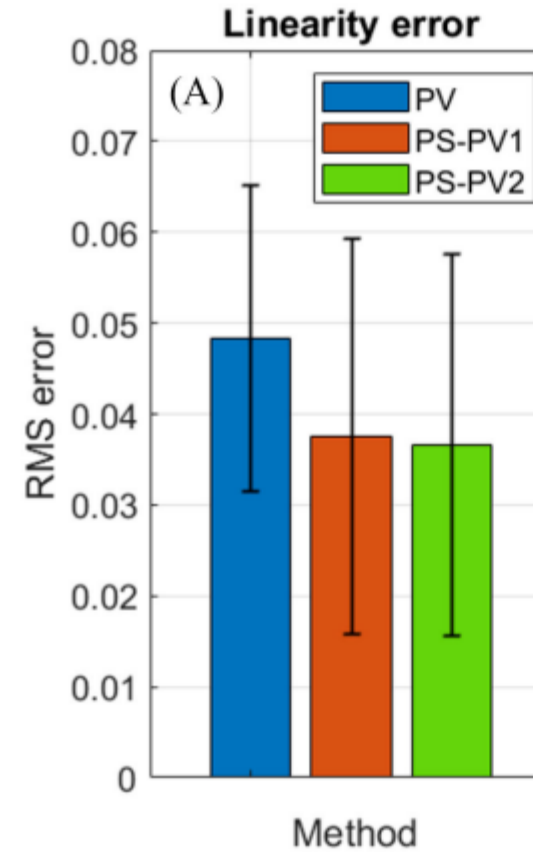
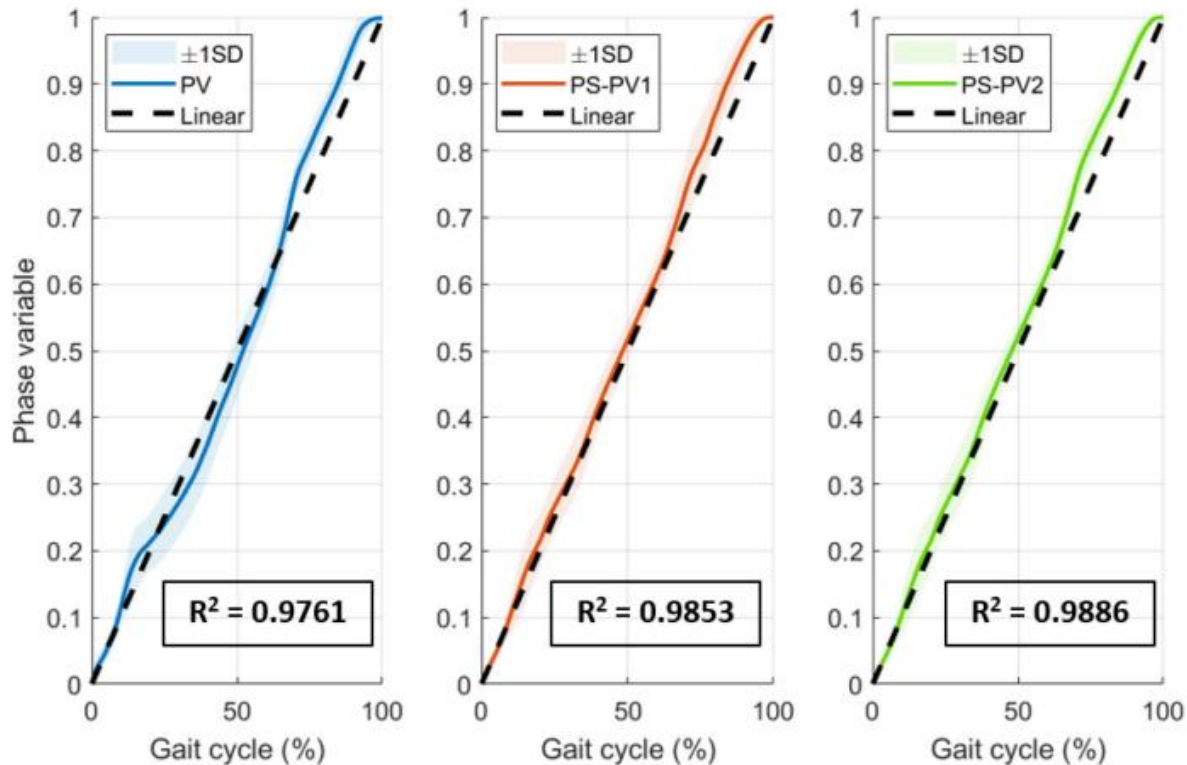


- A. IMU (Thigh)
- B. Harmonic drive (Knee)
- C. BLDC motor (Knee)
- D. BLDC motor (Ankle)
- E. Harmonic drive (Ankle)
- F. FSR sensor (Heel)

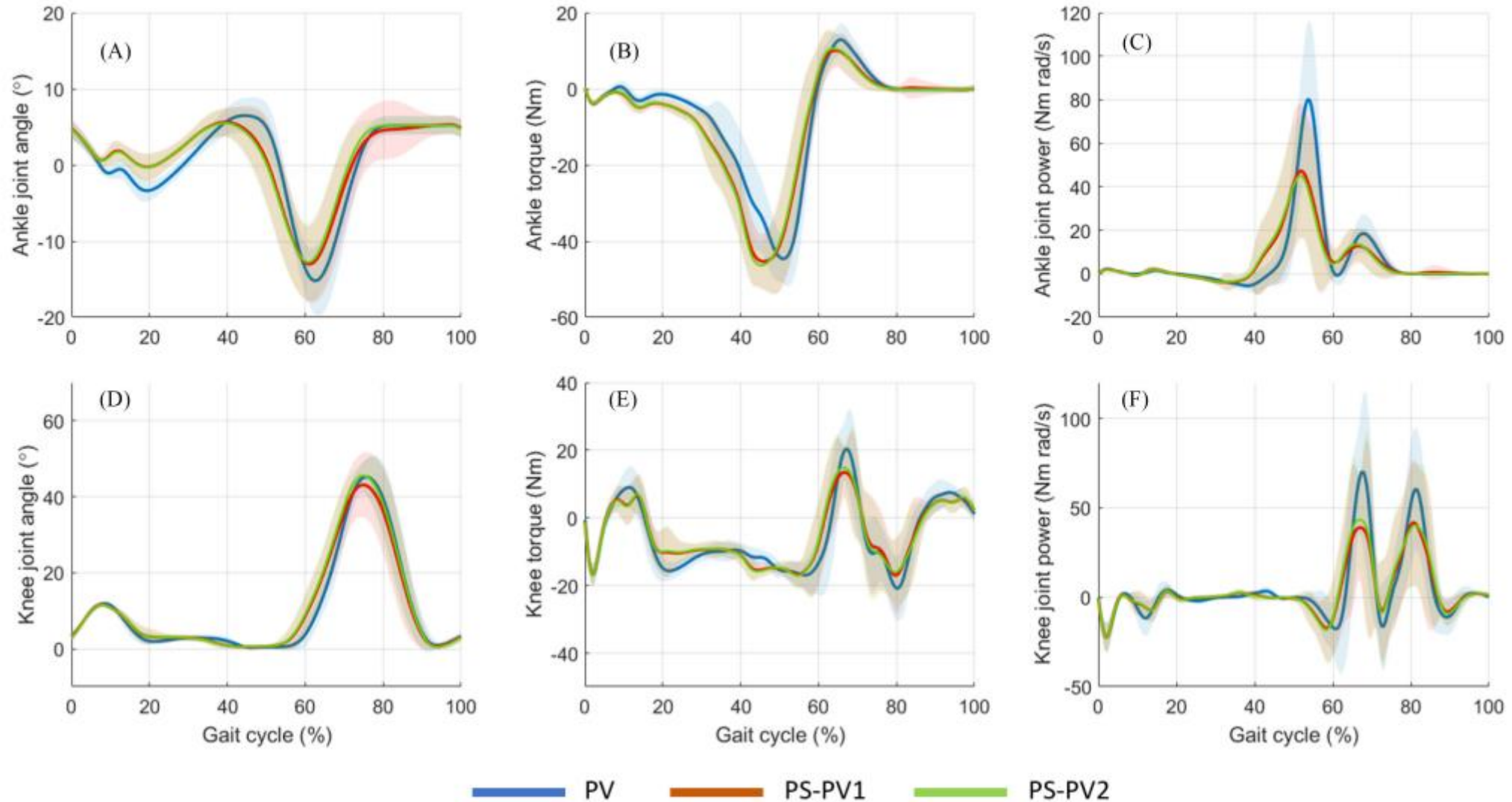
IMU detect thigh motion
high resolution optical encoder
healthy young subject 1.7m 70kg.
0.8m/m
handrailed treadmill

Real-Time Phase Shifting Implementation

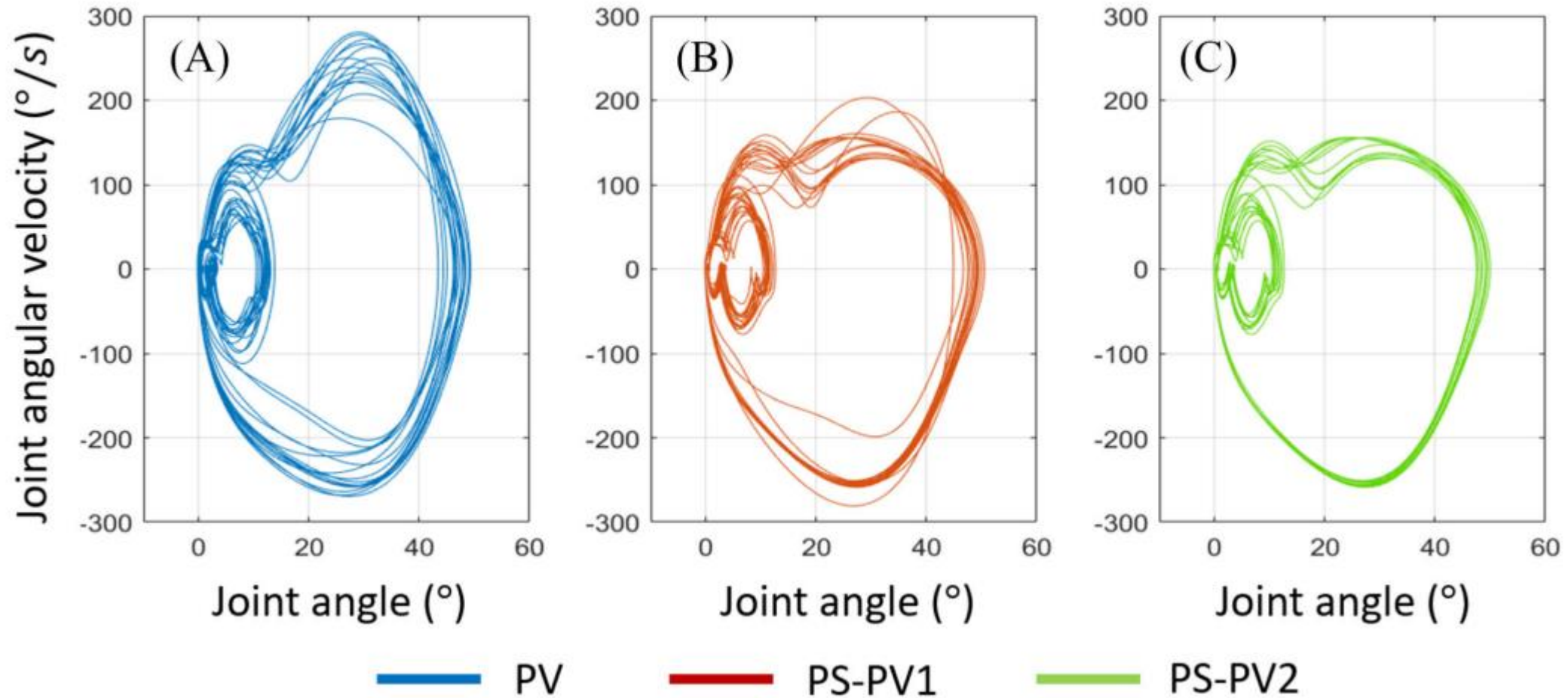
	PV	PS-PV1	PS-PV2
Thigh angle	0.86 ± 0.03	0.89 ± 0.02	
Thigh integral	0.90 ± 0.05	0.90 ± 0.06	0.91 ± 0.05



Real-Time Phase Shifting Implementation



Discussion



limits

- torque limit - $> 0.8\text{m/s}$ (slower than normal person)
- L-shape emulator \rightarrow difference between two limbs, slightly higher hip extension occur on prosthesis side.
- But still PSPV shows ideal cosine function
- PS is user specific \rightarrow learning based gait phase estimation model using proposed PSPV

Conclusion

- PSPV using user thigh angle information
- PS improve linearity and HS detection.
- Real time implementation performed.
- linear PV assist more controlled PO
- phase portrait: PSPV has fewer deviations from limit cycle.
- phase shifted thigh angle integral PV is better perform
- PSPV is more accurate gait progress detectopm amd thus robust walking



Q&A



Thank You
For Your Attention