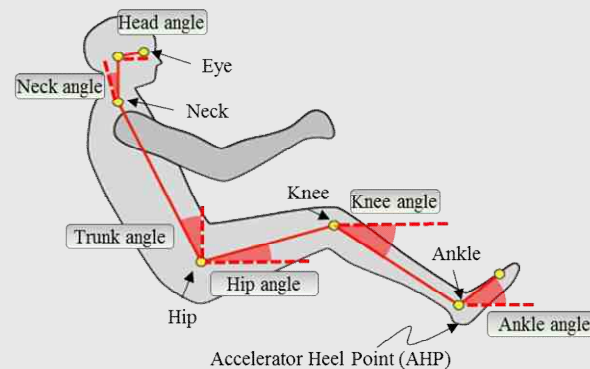


Development of Statistical Models for Predicting a Driver's Hip and Eye Locations

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**Ergonomic Design
Technology Lab**



HYUNDAI | NEW THINKING.
NEW POSSIBILITIES.

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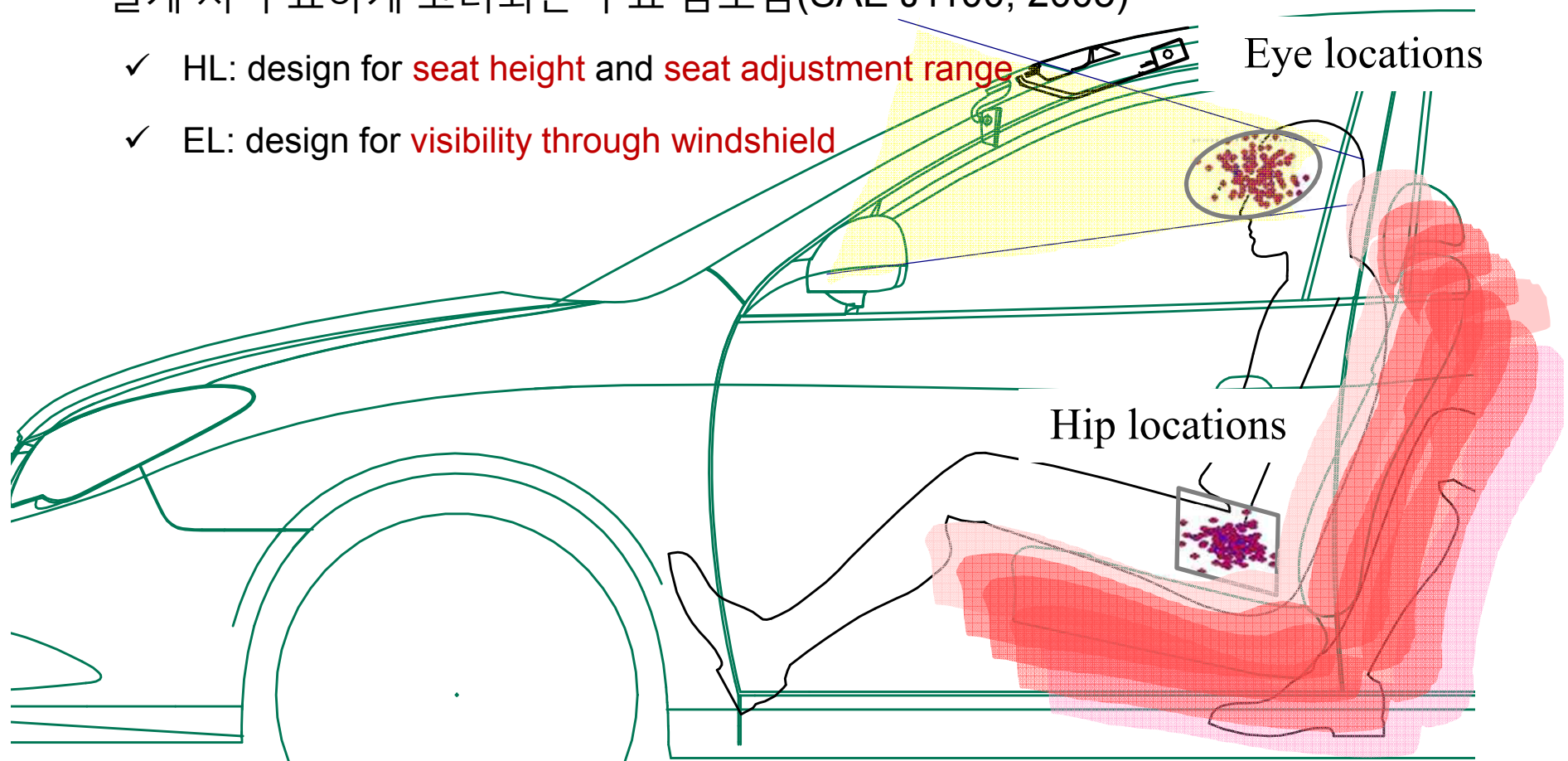
Agenda

- 연구 배경 및 필요성
 - 연구 목적
 - 연구 방법
 - ✓ Hip & eye locations 측정 protocol
 - ✓ Statistical geometric model (SGM) 개발
 - 연구 방법
 - ✓ Posture-based model
 - ✓ Seat configuration-based model
 - ✓ Model evaluation
 - Discussion
-

Drivers' Hip & Eye Locations (HL & EL)

- Hip location (HL)과 eye location (EL)은 occupant package layout (OPL) 설계 시 주요하게 고려되는 주요 참조점(SAE J1100, 2005)

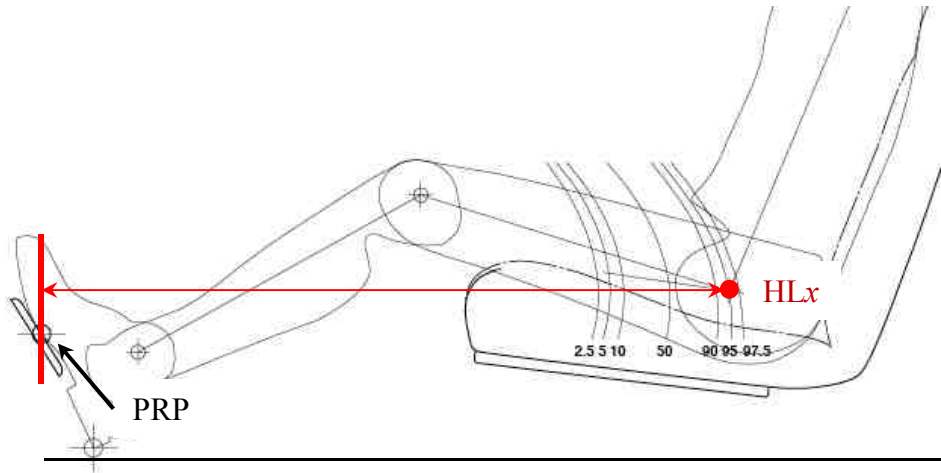
- ✓ HL: design for **seat height** and **seat adjustment range**
- ✓ EL: design for **visibility through windshield**



Statistical Model: H-point Prediction Models

- SAE J1517 (2011)은 seat 조절 범위를 설계하기 위해 95%의 운전자를 수용하는 H-point prediction model 개발

(Unit: mm)



$$HLx_{2.5} = 687.1 + 0.895 \times H30 - 0.0021 \times H30^2$$

$$HLx_{97.5} = 936.6 + 0.614 \times H30 - 0.0019 \times H30^2$$

where: $HLx_{2.5}$ = horizontal reference location of the 2.5th %ile H-point aft of the pedal reference point (PRP)

$HLx_{97.5}$ = location of the 97.5th %ile H-point aft of the PRP

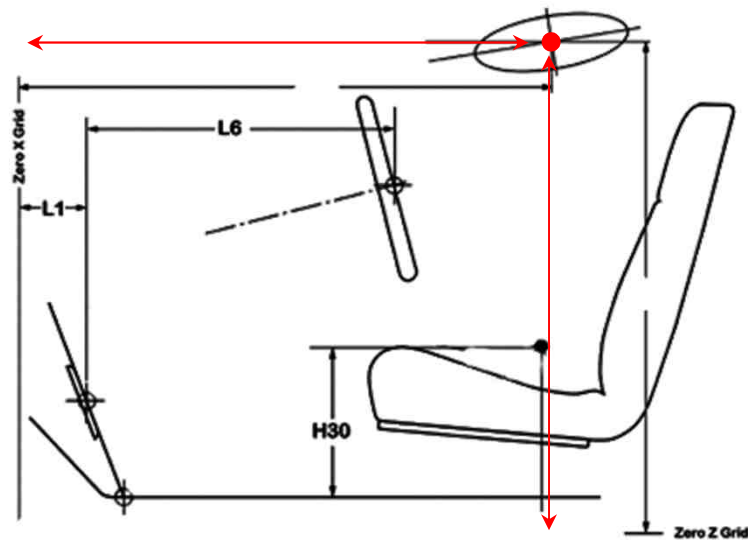
H30 = seat height

Limitations

- 1) 개발된 추정식에 대한 성능을 제시하지 않음 (e.g., adj. R^2 , RMSE)
- 2) Human variables (e.g., body segment lengths, driving postures) 고려하지 않음
- 3) 다양한 seat 조절 변수 (e.g., seatback angle, cushion angle) 고려하지 않음

Statistical Model: EL Prediction Models

- SAE J941 (2010)은 occupant package layout (OPL) 변수를 사용하여 EL을 (Unit: mm) 추정하는 모델을 개발함



$$EL_x = L1 + 664 + 0.587 \times L6 - 0.176 \times H30 - 12.5 \times t$$

$$EL_{y-left} = W20 - 32.5$$

$$EL_{y-right} = W20 + 32.5$$

$$EL_z = H8 + 638 + H30$$

where:

PRP = pedal reference point,

AHP = accelerator heel point,

L1 = PRPx coordinate,

L6 = steering wheel center to PRP,

H30 = seat height (z coordinate of the SgRP, measured vertically from AHP),

t = transmission type (0 = without clutch pedal; 1 = with clutch pedal),

W20 = SgRP y coordinate,

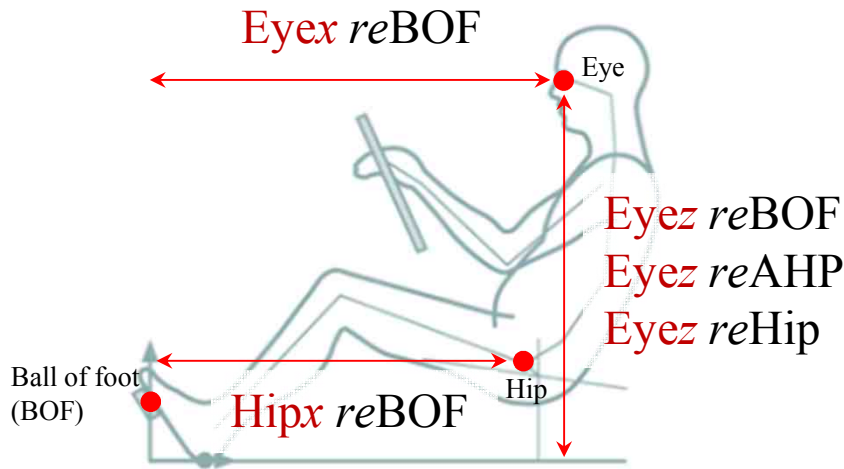
H8 = AHP z coordinate

Limitations

- 1) 개발된 추정식에 대한 성능을 제시하지 않음(e.g., adj. R^2 , RMSE)
- 2) Human variables (e.g., body segment lengths, driving postures) 고려하지 않음
- 3) 다양한 seat 조절 변수(e.g., seatback angle, cushion angle) 고려하지 않음

Statistical Model: HL and EL Prediction Models

- Reed et al.(2002)은 anthropometric 변수(stature, sitting height/stature), OPL 변수(H30, SW to BOF_x, cushion angle), design reference points (HL, EL)의 linear relationship을 사용하여 HL과 EL의 추정식 개발



Variable (mm or °)	Intercept	Anthro. vars.		OPL vars.			R^2_{adj}	RMSE
		Stature (mm)	Sitting Height/ Stature	Seat Height (H30; mm)	SW to BOF _x (L6; mm)	Cushion Angle (L27; °)		
Hipx reBOF	84.8	0.4659	-430.1	-0.1732	0.4479	-1.04	.78	35.9
Hip-to-eye angle	-72.7	0.00642	115.7	—	0.0147	0.11	.20	3.9
Eyex reBOF	-836.6	0.5842	916.6	-0.1559	0.6101	—	.71	50.9
Eyez reAHP	-267.1	0.3122	679.9	1.0319	0.0292	—	.89	21.8
Eyez reHip	-916.0	0.1187	1347.2	—	0.1563	1.15	.23	41.7
Eyez reHip	-261.5	0.3336	675.8	—	-0.0544	—	.72	22.9

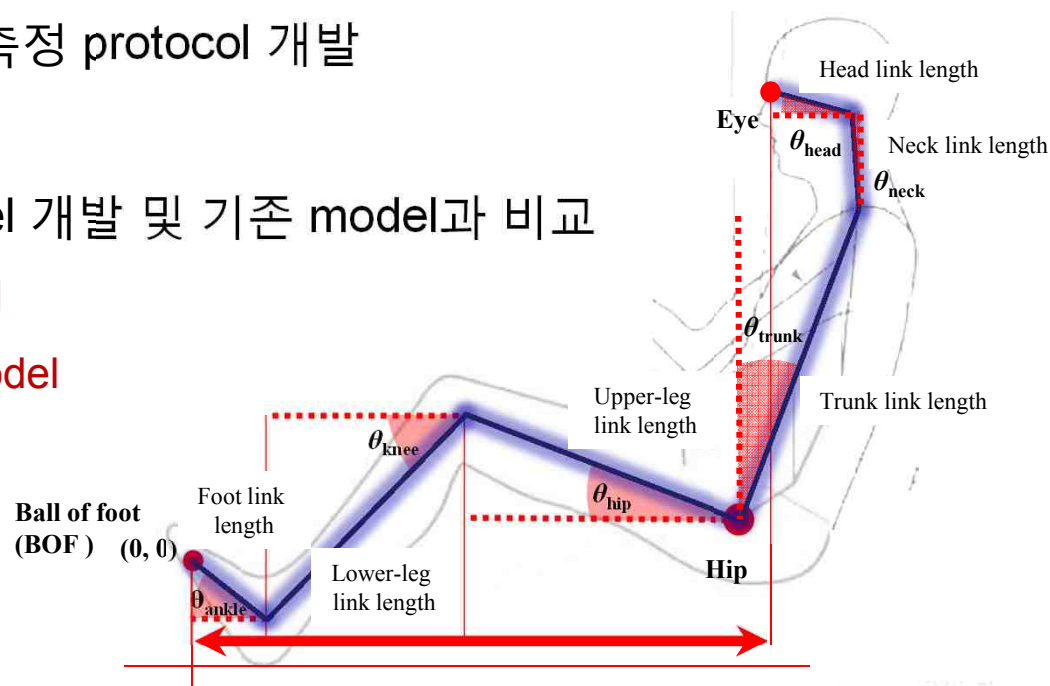
Limitations

- Body segment의 lengths와 driving posture를 고려하지 않음
- Cushion angle 외 seat 조절 변수(e.g., seatback angle, seat height) 고려하지 않음

연구 목적

Development of Statistical Models for Predicting a Driver's Hip and Eye Locations

- 1) 운전자의 hip & eye location 측정 protocol 개발
- 2) Hip & eye location 추정 model 개발 및 기존 model과 비교
 - Driving posture based model
 - Seat configuration based model

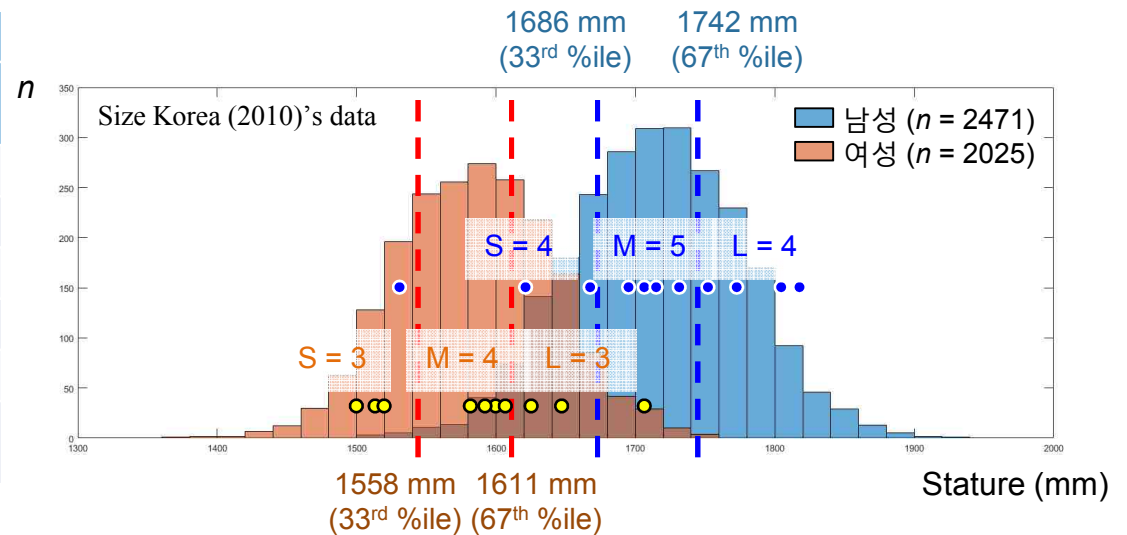


실험 참여자

- $n = 23$ 명(남성: 13명, 여성: 10명)
- 연령: $M = 29.2$, $SD = 7.3$, $R = 24 \sim 51$ 세
- 실험 참여자의 신장은 Size Korea (2010) **한국인 평균 인체크기와 유사**
 ⇒ 통계적으로 적합하게 한국인 모집단을 대표

	남		여	
	Size Korea	본 실험	Size Korea	본 실험
<i>M</i>	171.4	171.1	158.4	159.7
<i>SD</i>	6.1	8.4	5.6	6.6
<i>Min</i>	-	152.2	-	150.4
<i>Max</i>	-	183.0	-	172.8
<i>MD</i>				
paired <i>t</i> -test	$t(2459) = 2.18$ $p = 0.91$		$t(2016) = 2.26$ $p = 0.54$	

*Size Korea (2010) 6차 인체측정자료



실험 Protocol

S1. 실험 설명 및 동의서 작성 (10 min)

S2. 인체 측정 및 marker 부착 (10 min)

S3. 선호 운전 자세 조절 (10 min)

S4. Seat 조절 Profile 생성 (5 min)

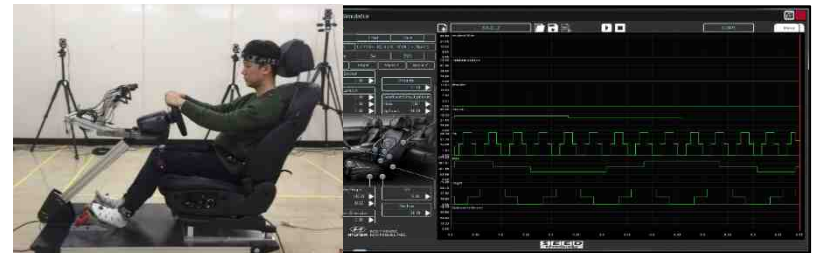
S5. 눈 위치 및 운전 자세 측정(7 min)

2회 반복

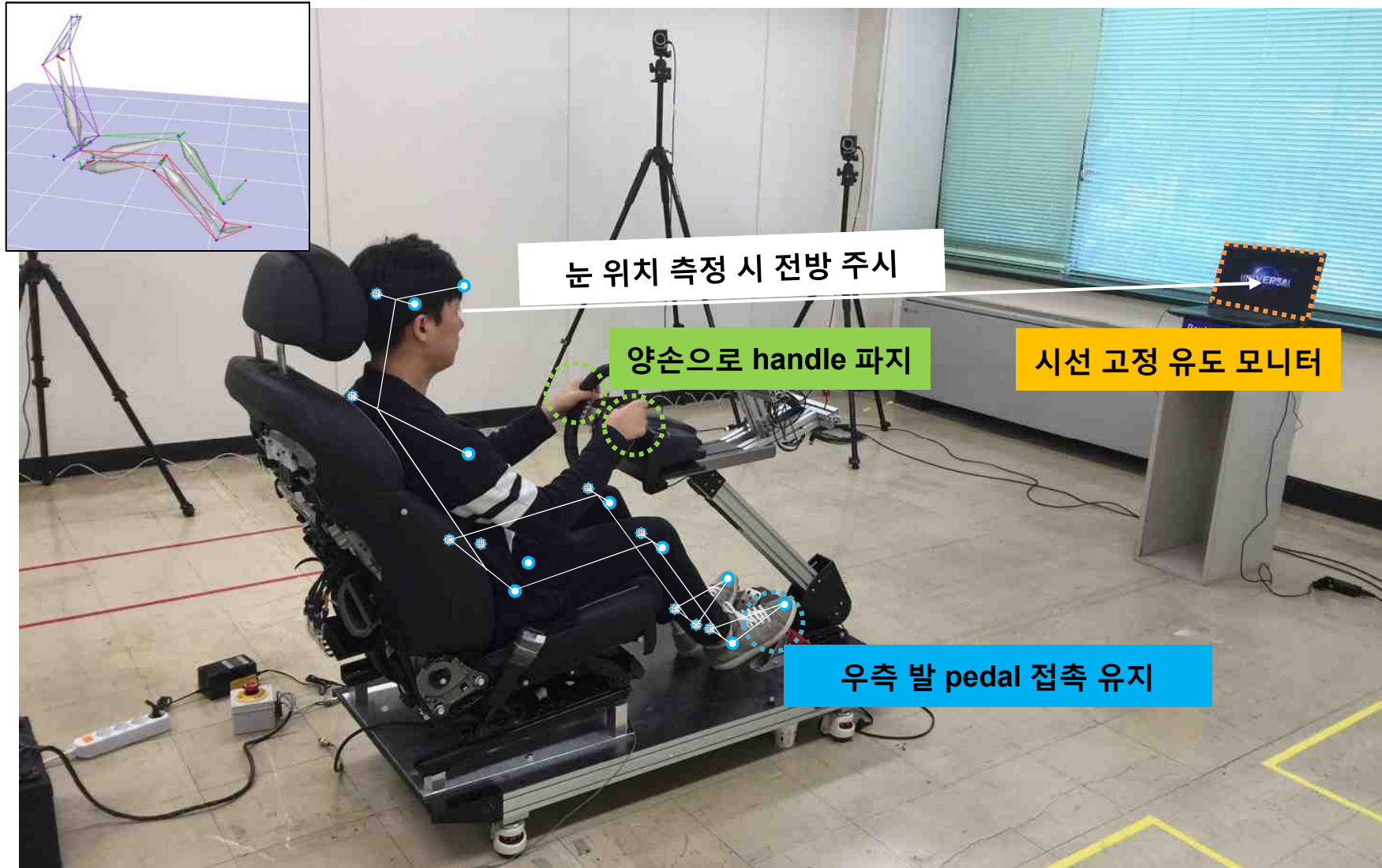
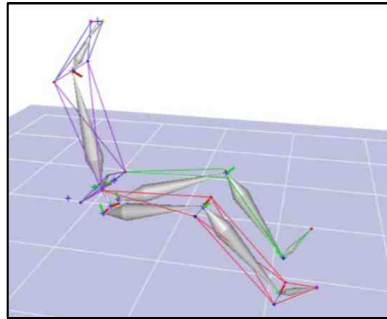
총 소요 시간: 약 1시간 / 인

- 인체 측정 항목: **stature**, **body weight**
- Reflective marker: 19개

- Experimental design에 따라 **81가지** 생성
 - ✓ Factors: **recline**, **tilt**, **slide**, **height**
 - ✓ Factor level: **3** (선호 위치, 선호 위치 $\pm \alpha$)



실험 환경



눈 위치 측정 시 전방 주시

양손으로 handle 파지

시선 고정 유도 모니터

우측 발 pedal 접촉 유지

Experimental Design

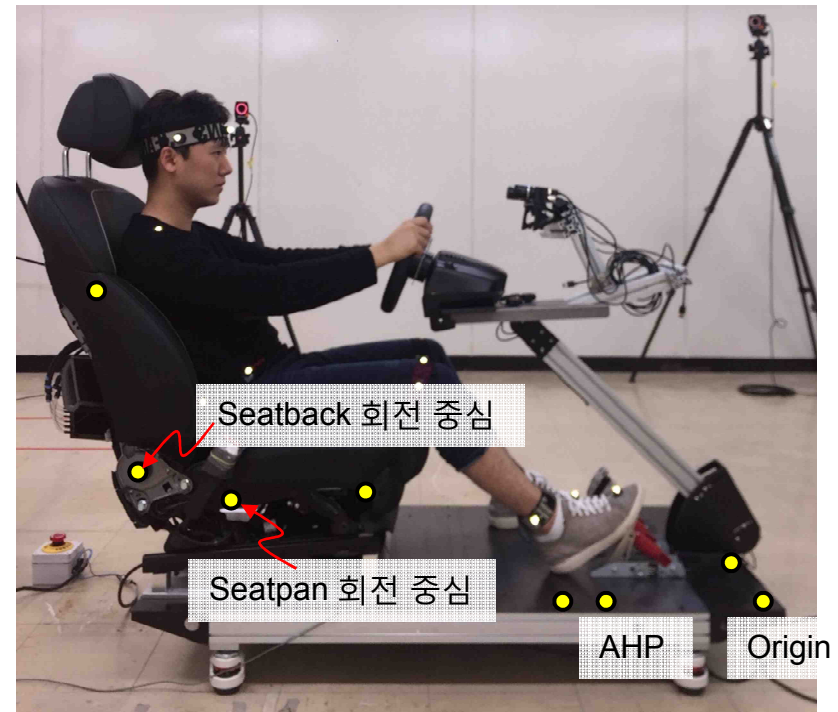
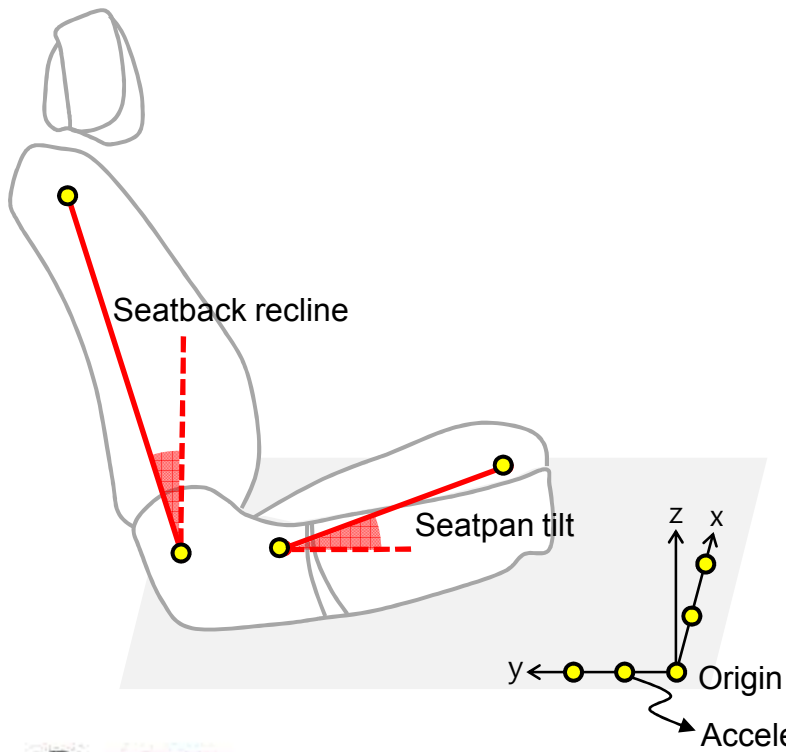
- 인자: (1) seatback recline, (2) seatpan tilt, (3) seat slide, (4) seat height
- 인자 수준: 3-level (선호 위치, 선호 위치 $\pm \alpha$)
 - ✓ Setback recline ($\pm 5^\circ$), seatpan tilt ($\pm 15 \text{ mm}$)
 - ✓ Seat slide ($\pm 60 \text{ mm}$), seat height ($\pm 25 \text{ mm}$)

항목	Factor	Factor level		
1	Seatback recline	P - 5°	선호 위치 (Preference, P)	P + 5°
2	Seatpan tilt	P - 15 mm		P + 15 mm
3	Seat slide	P - 60 mm		P + 60 mm
4	Seat height	P - 25 mm		P + 25 mm
실험 조건	L81(3 ⁴) + 선호 위치 = 총 82 조건			
실험 소요 시간(명)	7 sec/조건 × 82조건 × 2회 = 약 19분			

※ 통제 변인: headrest, shoulder, lumbar, bolster 조절량

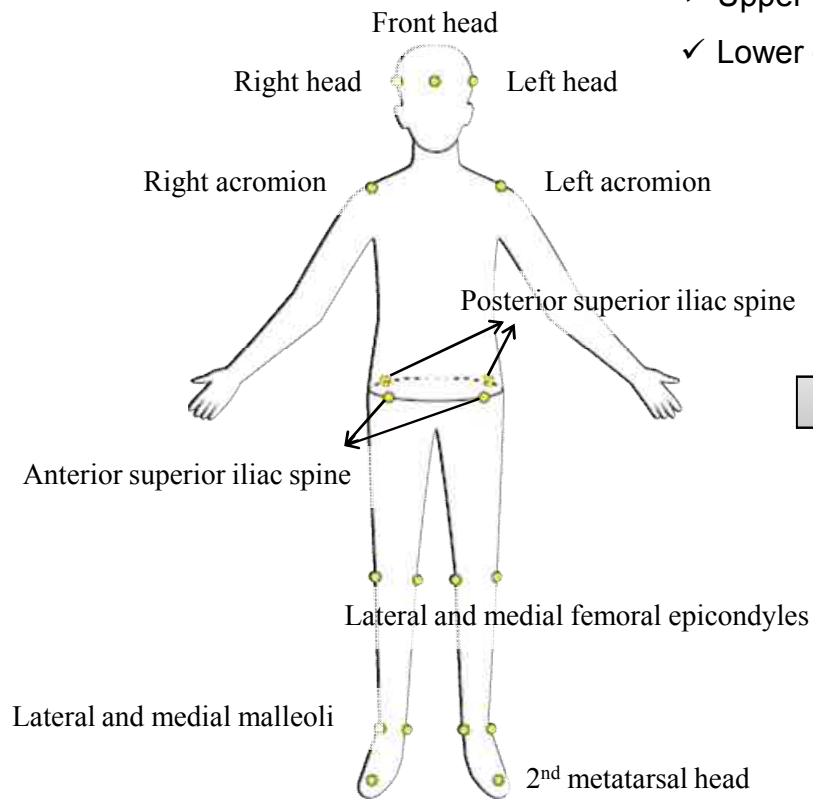
Reflective Marker: Seat

- ❑ Seat 조절량(seat 부위별, seat 전반) 측정 marker 부착
- ❑ Global coordinate system (origin) 정의를 위한 marker 부착
 - ✓ 기준점(0,0,0)으로부터 서로 수직을 이루는 \vec{x} , \vec{y} 생성(지면과 평행)
 - ✓ $\vec{z} = \vec{x} \times \vec{y}$ (지면과 수직)

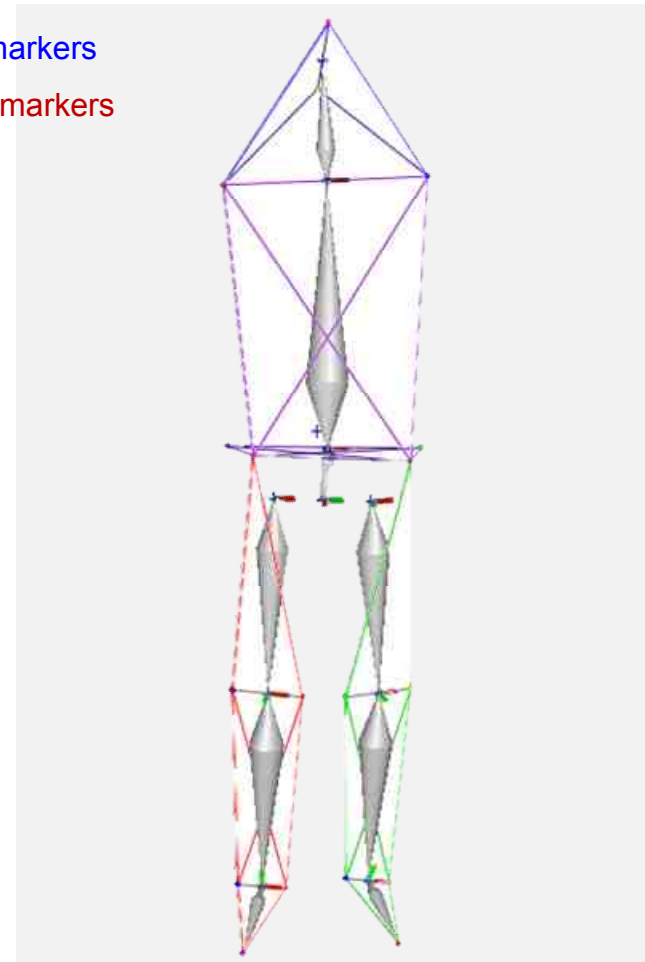


Reflective Marker: Human

□ 19 markers on bony landmark

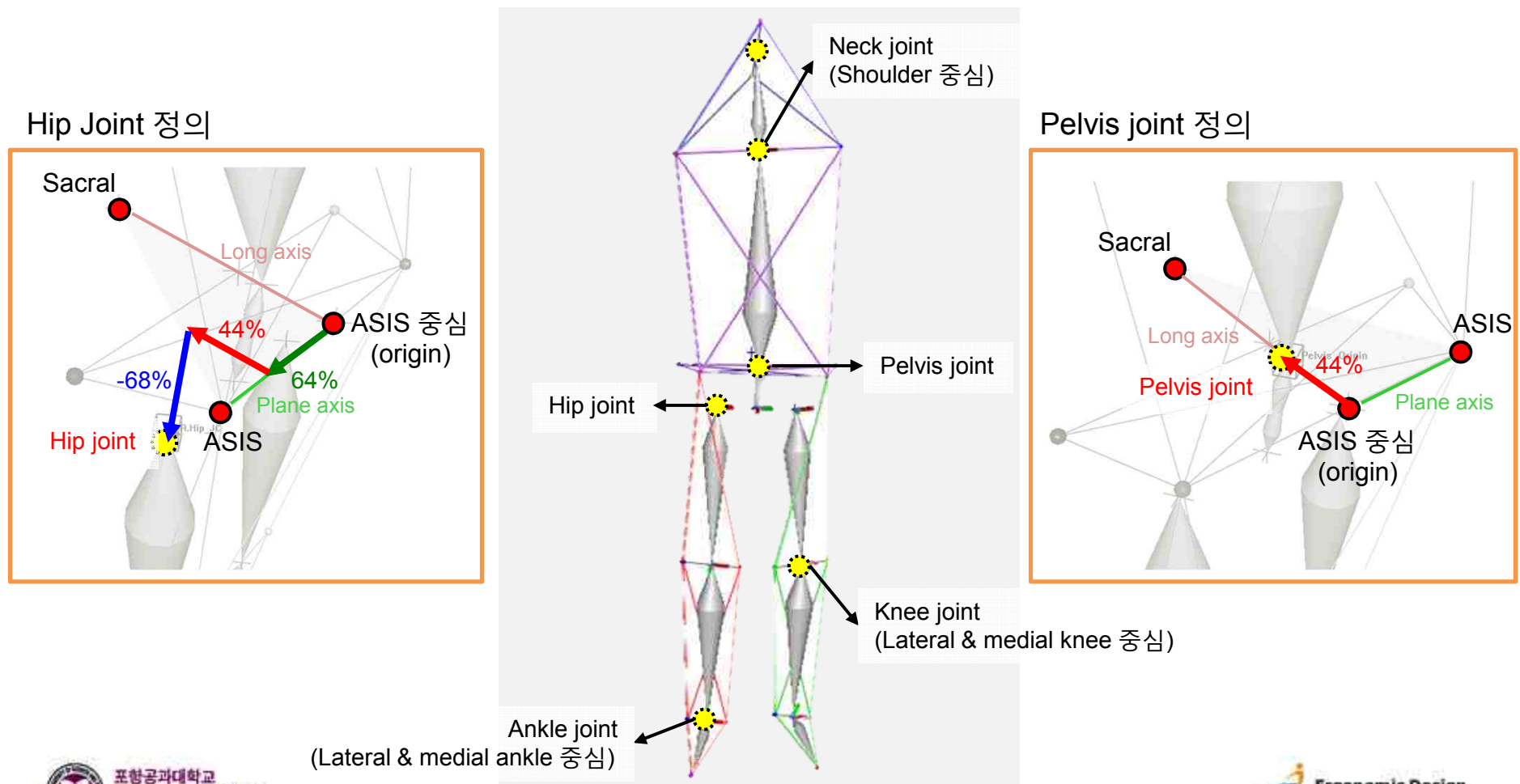


- ✓ Upper extremity: 5 markers
- ✓ Lower extremity: 14 markers



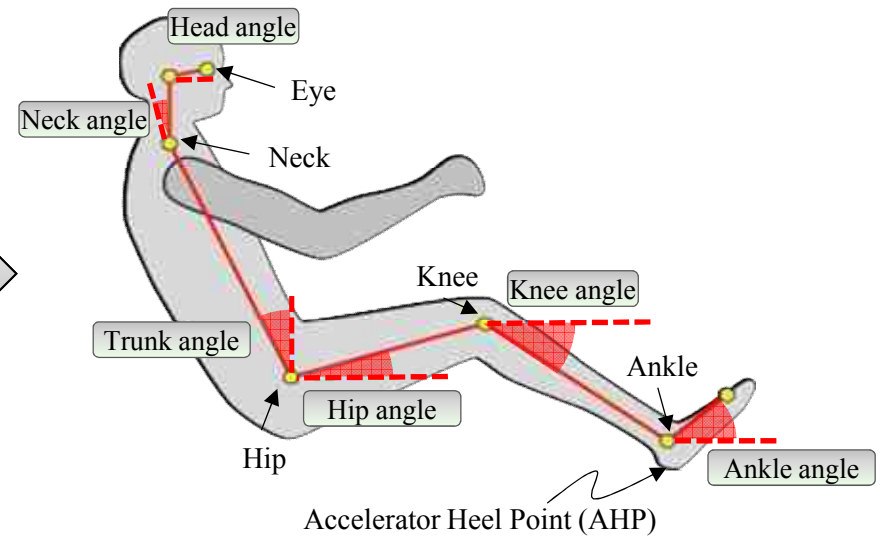
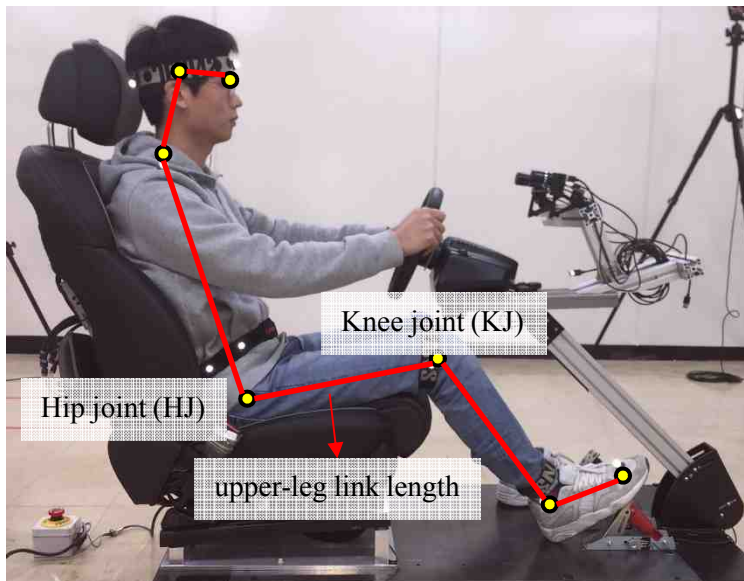
Joint Center

□ HelenHayes marker set (Vaughan et al., 1999)의 joint center 정의 참고



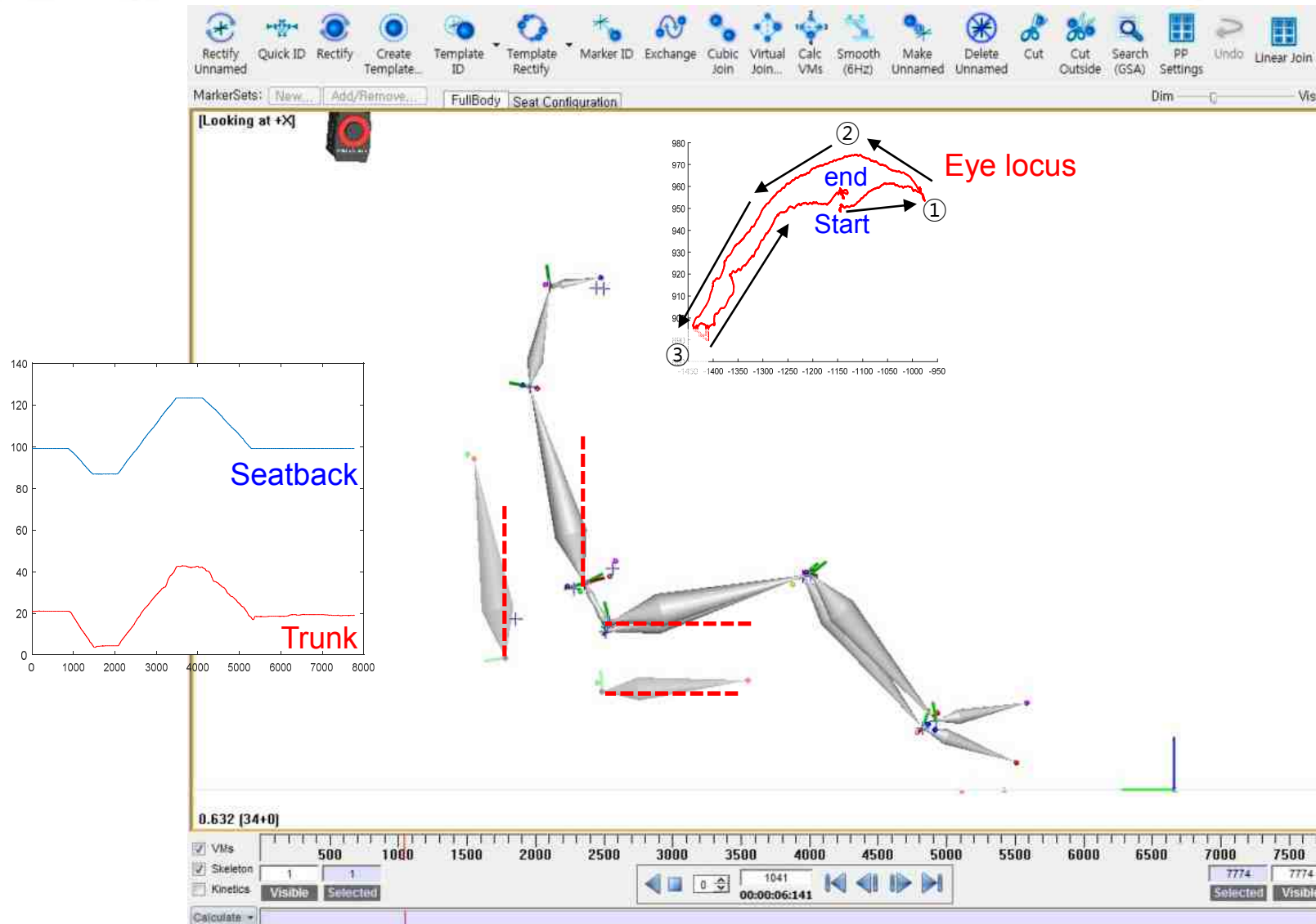
Joint Angle & Link Length

- Flexion/extension angle: sagittal plane에서 linkage 사이 각도
- Link length: Joint center간 Euclidian distance



예) upper-leg link length = $\sqrt{(Hj_x - Kj_x)^2 + (Hj_y - Kj_y)^2 + (Hj_z - Kj_z)^2}$

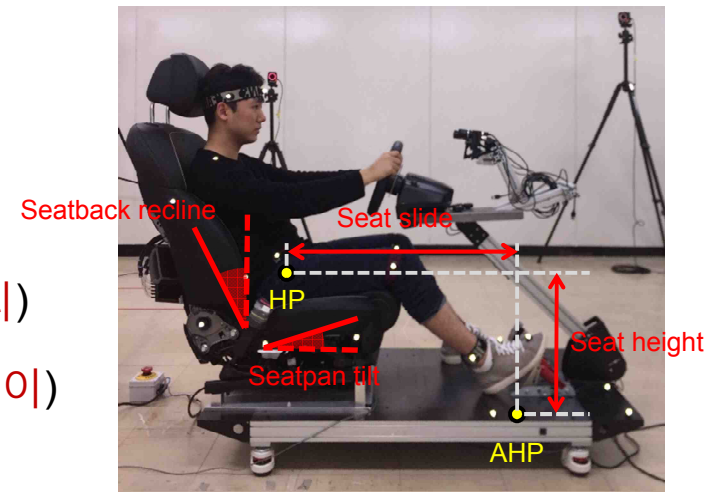
운전 자세 측정 예



Data Extraction

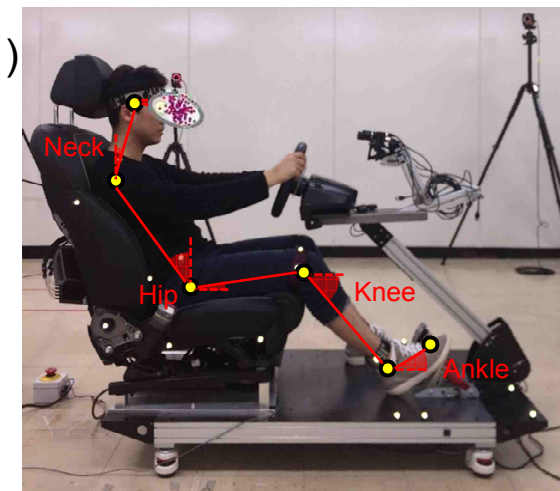
□ Seat configuration 관련 변수

1. Seatback recline
2. Seatpan tilt
3. Seat slide: HP_x reAHP (Hip point – AHP 수평 거리)
4. Seat height: HP_z reAHP (Hip point – AHP 수직 높이)

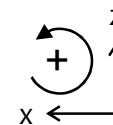


□ Posture 관련 변수

1. Joint angle: ankle, knee, hip, trunk, neck, head (6 가지)
2. Link length: foot, lower-leg, upper-leg, trunk, neck, head (6 가지)



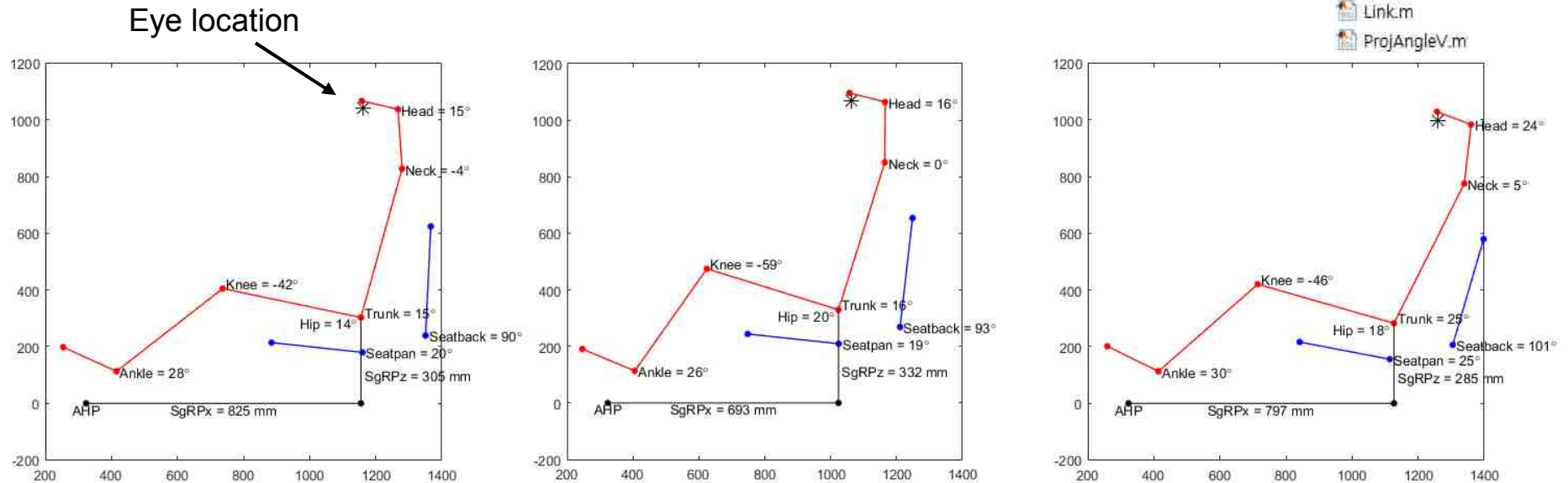
□ Hip & eye location



Data Extraction: Code (Matlab)

□ Sagittal 평면에서 seat 조절량 및 driving posture 추출

- drawLine.m
- EyeLocation_Main_170206.m
- Importfile_Posture.m
- Importfile_Seat.m
- Link.m
- ProjAngleV.m



Data 추출 결과 예시

SGM: Stepwise Regression Analysis

□ Stepwise regression을 통해 유의 인자($\alpha_{in} = 0.01, \alpha_{out} = 0.05$) 선택 후 회귀 분석

□ Predictors

✓ Posture based SGMs: 관절 각도 및 인체 분절 길이 사용

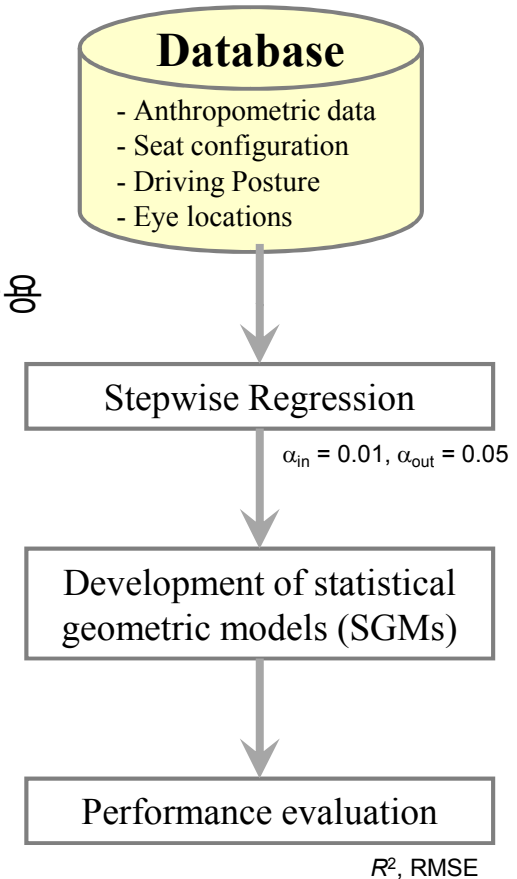
➤ Joint angle: $\theta_{ankle}, \theta_{knee}, \theta_{hip}, \theta_{trunk}, \theta_{neck}, \theta_{head}$

➤ link length: foot, lower-leg, upper-leg, trunk, neck, head

✓ Seat configuration based SGMs: 신장 및 seat 조절량 사용

➤ Stature

➤ Seat configuration: $\theta_{seatback}, \theta_{seatpan}, HP_x, reAHP, HP_z, reAHP$



Statistical Geometric Model (**SGM**): Summary

- ❑ Posture based: $R^2 = 0.90$, $RMSE = 21.2$ mm
- ❑ Seat configuration based: $R^2 = 0.90$, $RMSE = 18.3$ mm

	Location	Regression Equation	Adjusted R^2	$RMSE$ (mm)
Posture based SGMs	Eye _x reAHP			
	Eye _z reAHP			
	Hip _x reAHP			
	Hip _z reAHP			
Seat configuration based SGMs	Eye _x reAHP			
	Eye _z reAHP			
	Hip _x reAHP			
	Hip _z reAHP			

Posture-Based SGMs: Eye_x reAHP & Eye_z reAHP

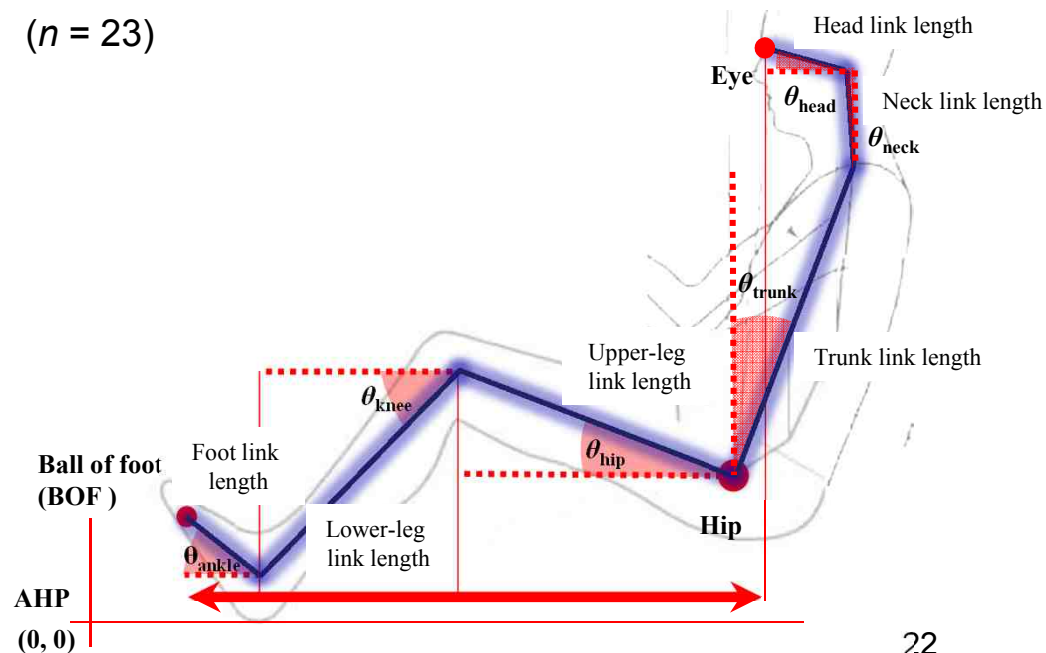
$$Eye_x \text{ reAHP} =$$

$$+ \{0.917 :$$

$$Eye_z \text{ reAHP} =$$

$$+ \{0.879 :$$

($n = 23$)



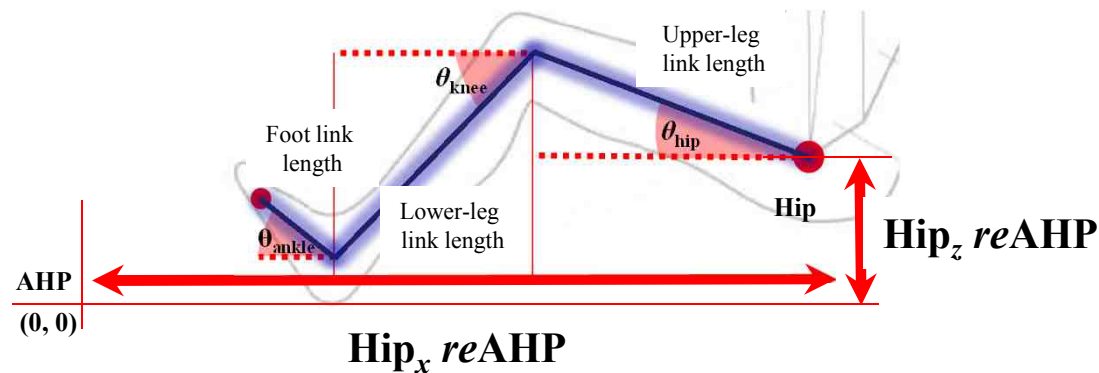
where: BOF = ball of foot,
 FL = foot link length,
 LL = lower-leg link length,
 UL = upper-leg link length,
 TL = trunk link length,
 NL = neck link length,
 HL = head link length,
 θ_{hip} = hip angle,
 θ_{knee} = knee angle,
 θ_{ankle} = ankle angle,
 θ_{trunk} = trunk angle,
 θ_{neck} = neck angle,
 θ_{head} = head angle,

Posture-Based SGMs: Hip_x reAHP & Hip_z reAHP

Hip_x reAHP =

Hip_z reAHP =

(n = 23)



where: AHP = accelerator heel point,
 FL = foot link length,
 LL = lower-leg link length,
 UL = upper-leg link length,
 θ_{hip} = hip angle,
 θ_{knee} = knee angle,
 θ_{ankle} = ankle angle

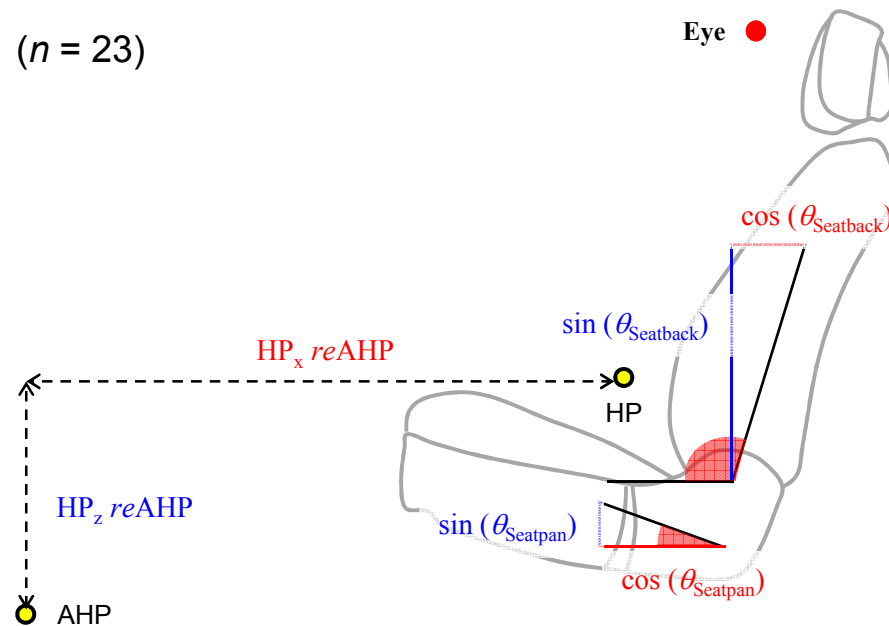
Seat-Based SGMs: Eye_x reAHP & Eye_z reAHP

Eye_x reAHP =

Eye_z reAHP =

+ {53.6 ×

(n = 23)



where: AHP = Accelerator Heel Point,
 HP: Hip point,
 HP_x reAHP = Horizontal HP-AHP length,
 HP_z reAHP = Vertical HP-AHP length,
 S = Stature
 θ_{seatback} = seatback angle,
 θ_{seatpan} = cushion angle

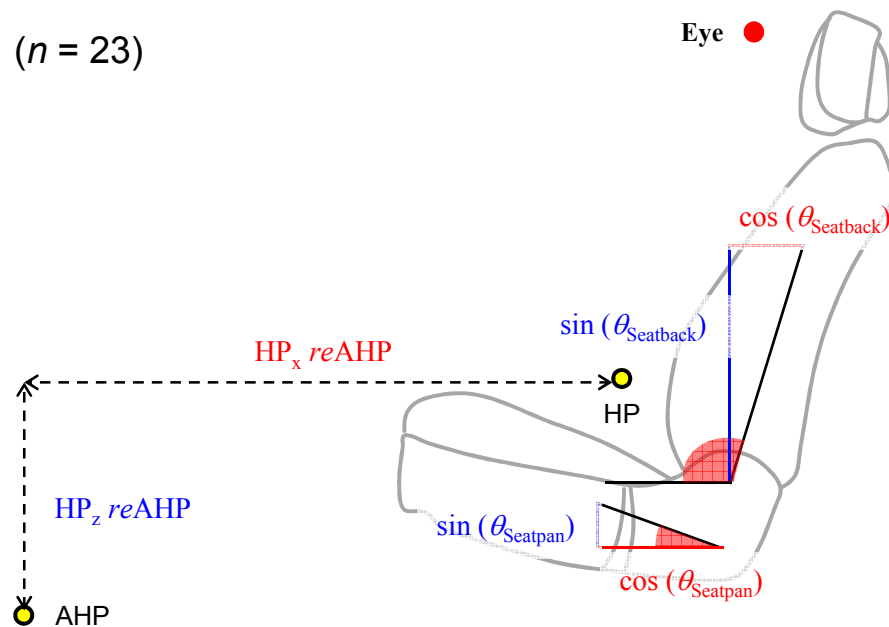
Seat-Based SGMs: Hip_x reAHP & Hip_z reAHP

$$\text{Hip}_x \text{ reAHP} = -373 + \{104 \times S\} + \{0.969 \times \text{HP}_x \text{ reAHP}\} - \{0.236 \times \text{HP}_z \text{ reAHP}\} - \{37.2 \times \cos(\theta_{\text{Seatback}})\} + \{311 \times \sin(\theta_{\text{Seatback}})\}$$

Adj. $R^2 = 0.92$; RMSE = 20.7 mm

$$\text{Hip}_z \text{ reAHP} = 81.8 + \{7.87 \times S\} + \{0.993 \times \text{HP}_z \text{ reAHP}\} - \{74.6 \times \cos(\theta_{\text{Seatback}})\} + \{205 \times \sin(\theta_{\text{Seatback}})\} - \{355 \times \cos(\theta_{\text{Seatpan}})\}$$

Adj. $R^2 = 0.59$; RMSE = 16.1 mm

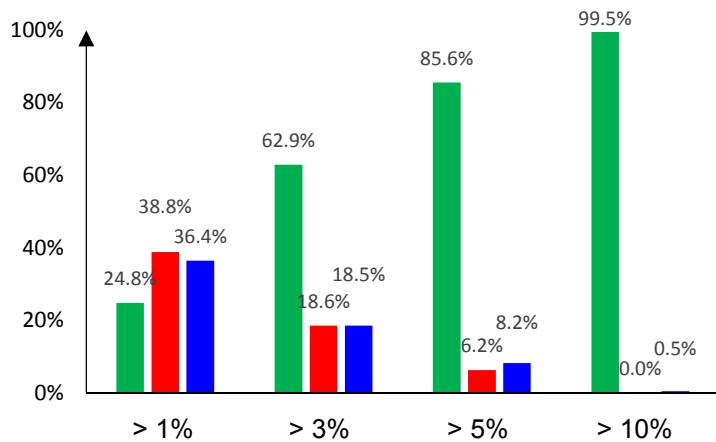
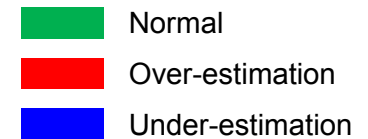


where: AHP = Accelerator Heel Point,
 HP: Hip point,
 HP_x reAHP = Horizontal HP-AHP length,
 HP_z reAHP = Vertical HP-AHP length,
 S = Stature
 θ_{seatback} = seatback angle,
 θ_{seatpan} = cushion angle

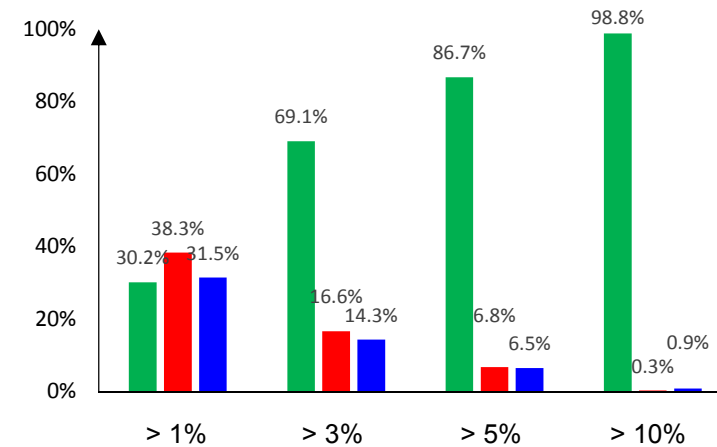
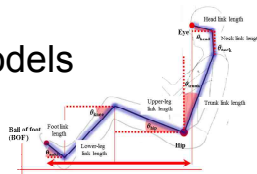
Model Evaluation: Posture vs. Seat Configuration

□ Sample data (6,576개) 중 **percentage of %error > 5%** (both over and under estimation)

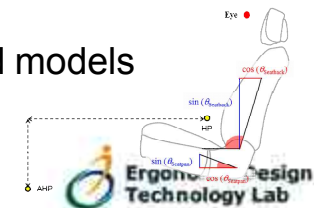
- ✓ Posture-based models: **14.4%**
- ✓ Seat configuration-based models: **13.3%**



Posture-based models



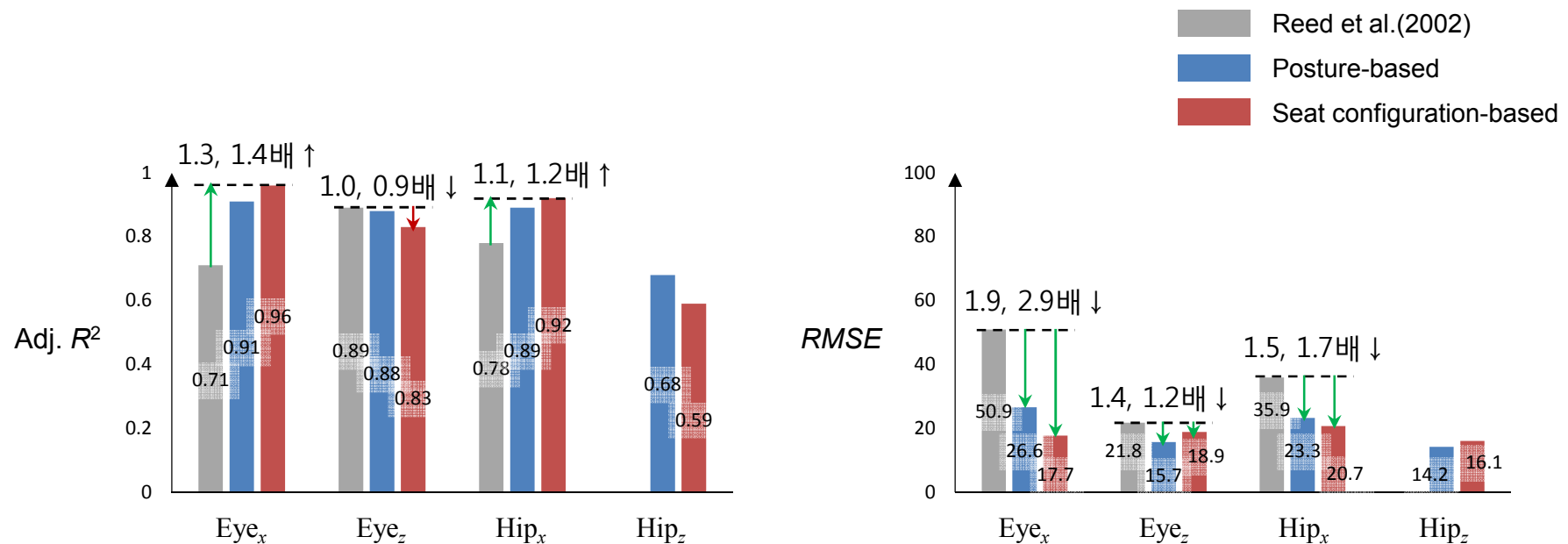
Seat configuration-based models



Model Evaluation: Reed et al.(2002) vs. Current

□ Prediction performance and accuracy: SGMs vs. Reed's models

- ✓ Adj. R^2 : SGMs $\geq 0.9 \sim 1.4 \times$ Reed et al.'s models
- ✓ RMSE: SGMs $\leq 1.2 \sim 2.9 \times$ Reed et al.'s models



Discussion

- 본 연구에서 개발된 seat configuration 및 posture-based models은 운전자의 eye location 및 hip location 추정 성능이 우수함($\text{adj. } R^2 = .83 \pm .13$, $\text{RMSE} = 19.1 \pm 4.2 \text{ mm}$)

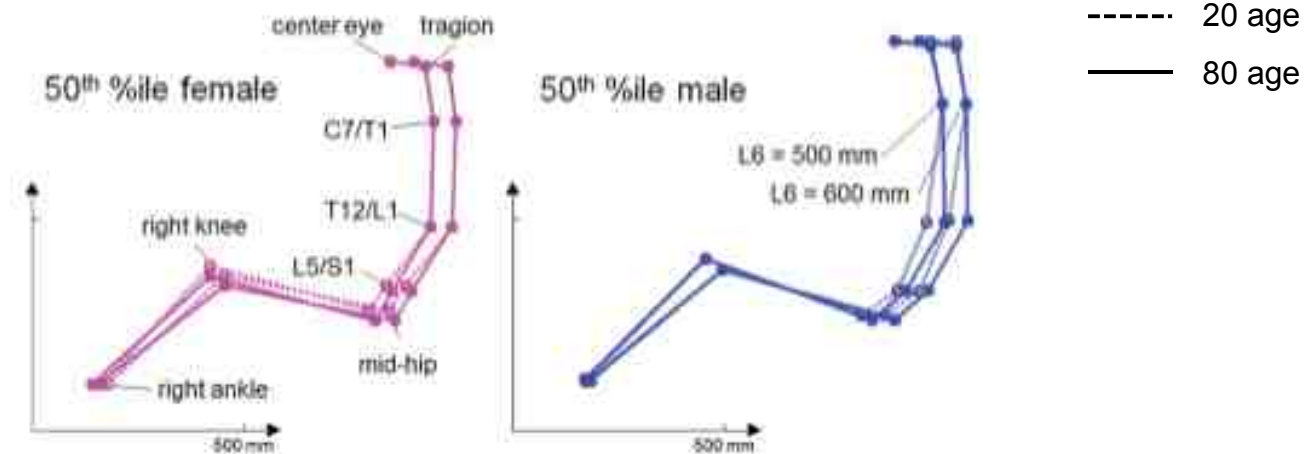
- Seat configuration-based models은 posture-based models 보다 generalizability, practicality 측면에서 선호
 - ← 한국인 실험참여자를 대상으로 개발된 posture-based model은 한국인 외 다른 인종에 대해 추정 성능이 감소할 것으로 사료됨
 - ← Posture-based model은 EL & HL 추정 시 joint angle, link length 정보 필요(seat configuration-based model은 stature 정보 필요)

- 선행연구의 운전자 comfortable driving posture (Hirao et al., 2006, 2007; Kyung and Nussbaum, 2009; Kyung et al., 2010; Park et al., 2000)는 posture-based models을 활용한 EL&HL 추정 시 사용될 수 있음

Discussion

Limitations

- 20 ~ 50 years 실험참여자를 대상으로 개발된 EL & HL 추정식은 age effect를 고려하지 않아 노년층(> 65 years)에 적용 시 추정 성능이 감소될 수 있음
 - ✓ Park et al. (2016)은 나이가 증가함에 따라 buttock muscle이 감소하여 노년층의 EL & HL이 젊은층보다 약간 낮음을 밝힘



Q & A

Thank you for your attention...