


재활 치료 운동 자세 가이드

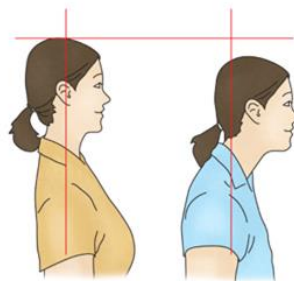
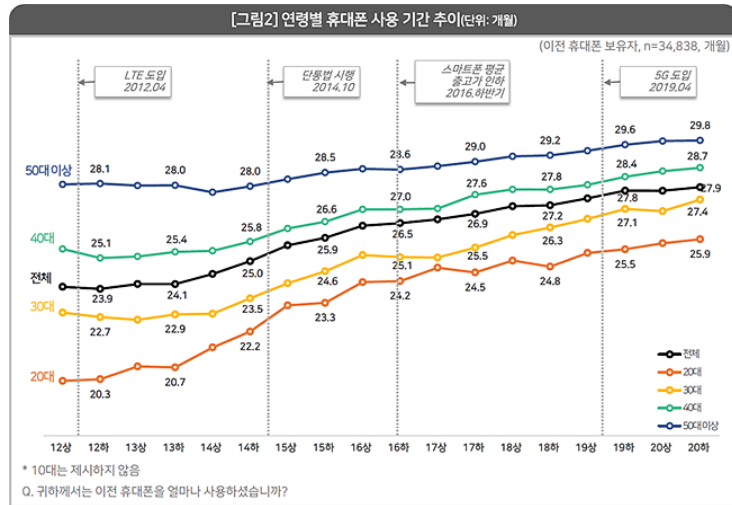
박세현
장지훈
반지훈



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Problem Definition



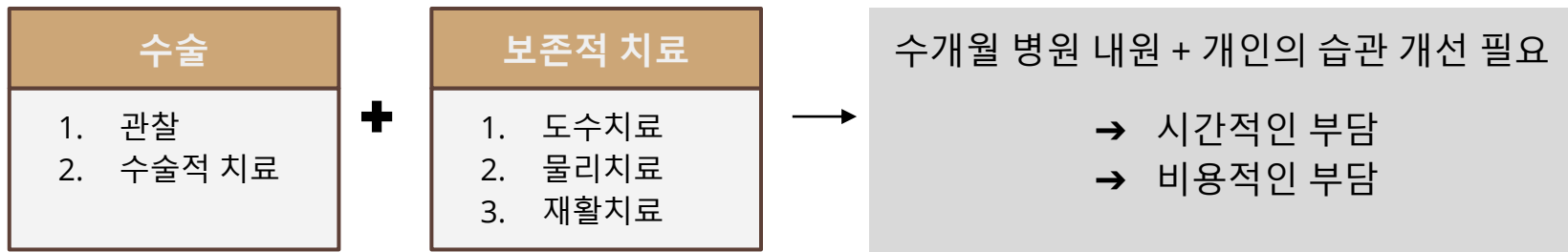
스마트폰 사용량 및 전자기기 사용량 증가

근골격계 질환 환자 증가

중증 상체 근골격계 질환 뿐만 아니라
거북목, 척추 측만증 등 경도의 질환 환자 증가

Problem Definition

- 근골격계 질환 치료 방법



환자 개인이 스스로 **본인을 촬영**하는 것과
동시에 **올바른 자세 예시**를 보면서 운동 자세를 할 수 있을까?

→ 재활 운동 자세를 가이드 하는 시스템을 만들자!

Related Work

Venture

- 운동 가이드 어플리케이션
- 자세에 대한 피드백 + 올바른 자세 예시 부족

Research

- Kinect, Vicon과 같은 센서에 의존
- 개인의 사용보다 병원용 사용에 초점

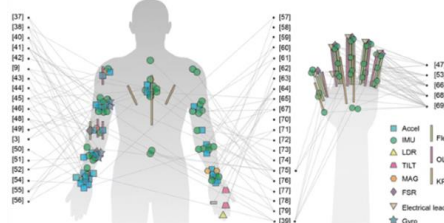
kaia health™



Artificial Intelligence-Based Wearable Robotic Exoskeletons for Upper Limb Rehabilitation: A Review



Fig. 4



Infographic of sensor placements

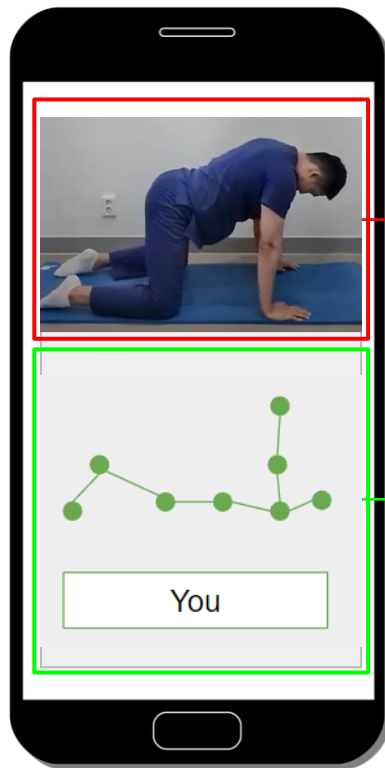
Target Scenario

User Interface

- 실제 올바른 동작 제시
- 본인의 관절 좌표 제시

Model

- Kinect Sensor를 이용한 관절 좌표 데이터 학습
- 실시간으로 모델이 사용자의 자세가 제대로 이루어지는지 판단



따라할 수 있는 동작 영상

Pose Detection:
사용자 관절 좌표
와 관절 간 각도
계산 후 올바른 동
작인지 판별

Mediapipe

- Using Blazepose to track the real-time body pose to predict the location 33 keypoints

- Estimation: Utilize two-step detector tracker ML pipeline

- Find the pose Region-of-interest (ROI)

- Video case: run only first frame

- Pose Estimation Component

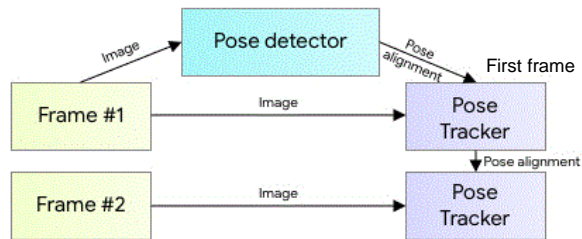
- Three degrees of freedom: x,y location and visibility
two virtual alignment keypoints

- Pose Detection by Extending BlazeFace

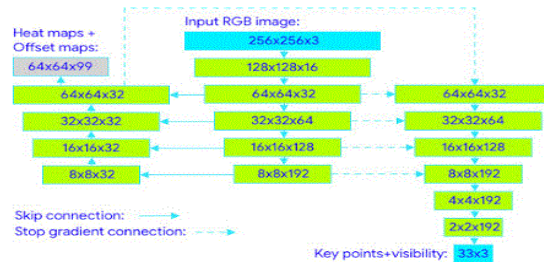
- Trained a face detector as a proxy for a pose detector

- Combined heat map/offset prediction of all keypoints

- Employ a heatmap and offset loss to train the center and left tower of the network
 - Remove the heatmap output and train the regression encoder
 - Heatmap to supervise a lightweight embedding



[그림 4] 사람의 포즈 추정 파이프 라인 개요

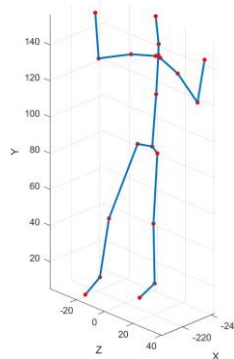


[그림 6] 네트워크 아키텍처 추적 : 히트맵 주도를 통한 회귀

Target Scenario



(e) m05



(e) m05

Dataset

Labelling된 Kinect 3D 관찰 좌표 위치

Model

올바른 Landmark 위치
좌표 학습된 mediapipe
모델

Application

사용자 재활 운동 시작

Landmark 좌표 추출

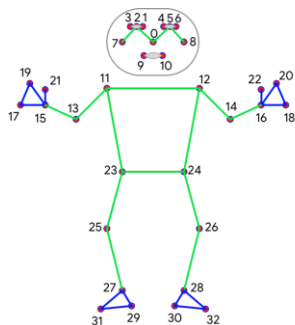
사용자에게서 Model이
학습한 landmark 좌표 추출 & 올바른 좌표와 비교

피드백

올바른 동작을 수행했다

Technical Challenges

프로젝트 초기 방향

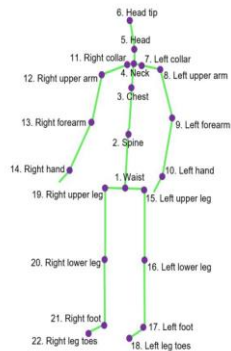


- 0. nose
- 1. right eye inner
- 2. right eye outer
- 3. left eye inner
- 4. left eye outer
- 5. left eye
- 6. left eye outer
- 7. right ear
- 8. left ear
- 9. mouth right
- 10. mouth left
- 11. right shoulder
- 12. left shoulder
- 13. right elbow
- 14. left elbow
- 15. right wrist
- 16. left wrist
- 17. right pinky knuckle #1
- 18. left pinky knuckle #1
- 19. right index knuckle #1
- 20. left index knuckle #1
- 21. right thumb knuckle #2
- 22. left thumb knuckle #2
- 23. right hip
- 24. left hip
- 25. right knee
- 26. left knee
- 27. right ankle
- 28. left ankle
- 29. right heel
- 30. left heel
- 31. right foot index
- 32. left foot index

Landmark 수
정

Mediapipe

ML Solution using BlazePose for
extracting coordinates from human



UI-PRMD: Kinect Coordinate

15 Healthy, 14 Unhealthy Subject, 10
movements, 10 Repetition, Label on
Correct Movement

Technical Challenges

API 전체를 수정해야 하는 문제

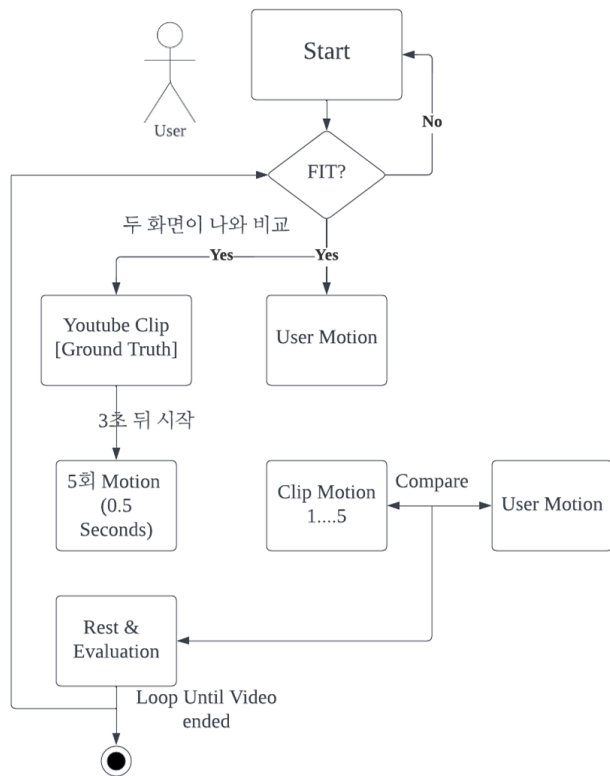
Mediapipe

ML Solution using BlazePose for
extracting coordinates from human

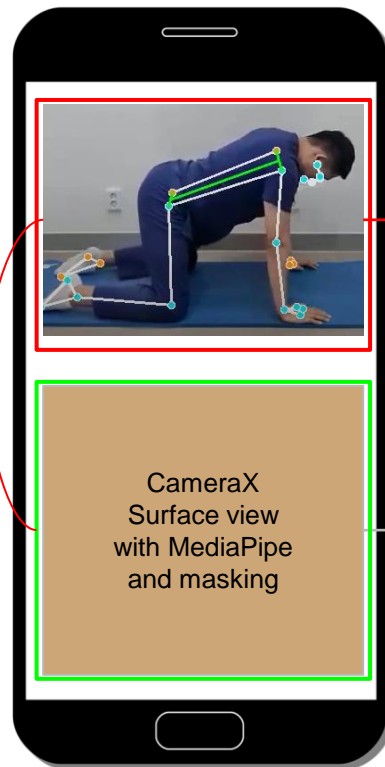
UI-PRMD: Kinect Coordinate

15 Healthy, 14 Unhealthy Subject, 10
movements, 10 Repetition, Label on
Correct Movement

Application Architecture [User Case]



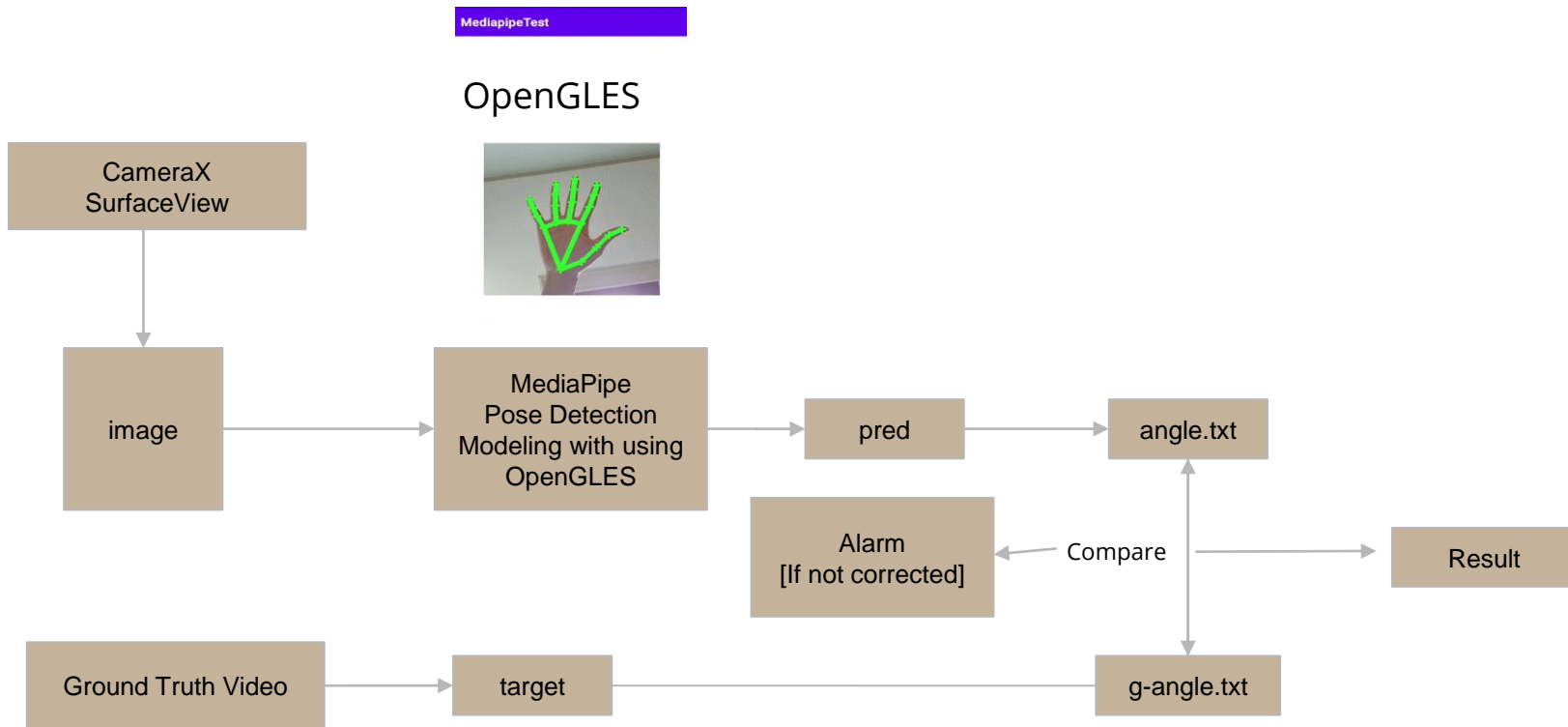
Compare Angle



Ground Truth:
올바른 자세 동영상
상 제시 + 올바른
각도 추출

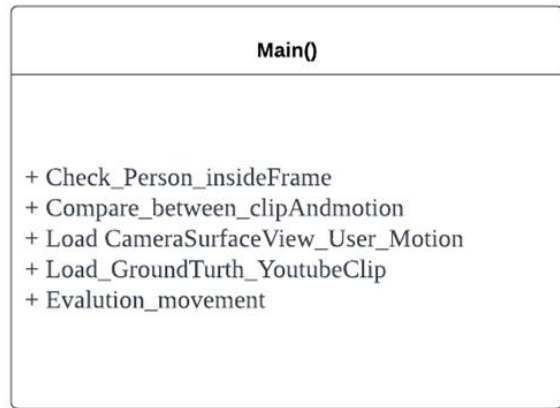
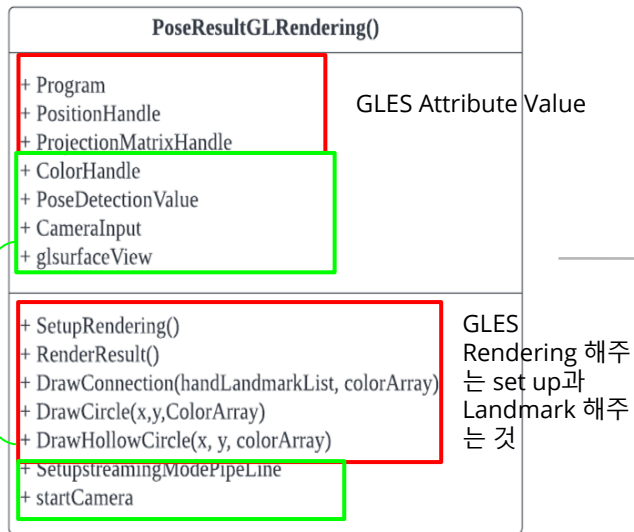
Pose Detection:
사용자 각도 추출

Application Architecture [초기]



Application Architecture

Camera Input 값으로 MediaPipe을 modeling을 하여 GLSurface View로 Landmark 구현 method



- Check_Pesrson_InsideFrame: user가 Frame 틀 안에 있는지 확인
- Load_CameraSurfaceView_User_Motion: PoseResultGLRendering 구현되어진 surfaceview 호출
- Load_GroudTruth_YoutbeClip: Groud_truth 설정으로 되어진 Youtube Clip 동영상 load
- Compare_bewteen_clipandMotion: 두 동영상의 angle value 을 비교
- Evaluation_movement: 비교된 pred 값들을 토대로 result 값 return

Application Architecture

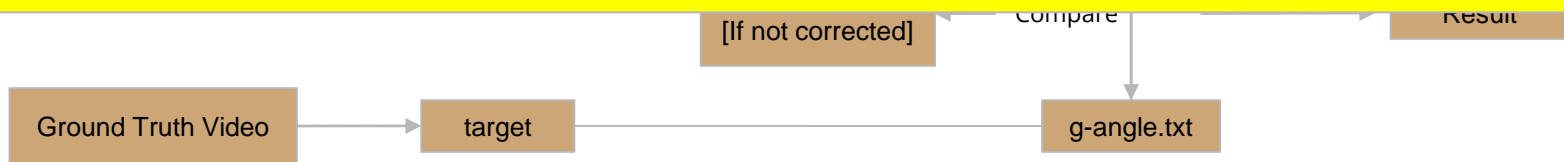
MediapipeTest

PoseResultGLRendering()

+ Program
+ PositionHandle
+ ProjectionMatrixHandle

Main()

CameraX와 MediaPipe Sync 문제



CameraX와 MediaPipe sync 문제

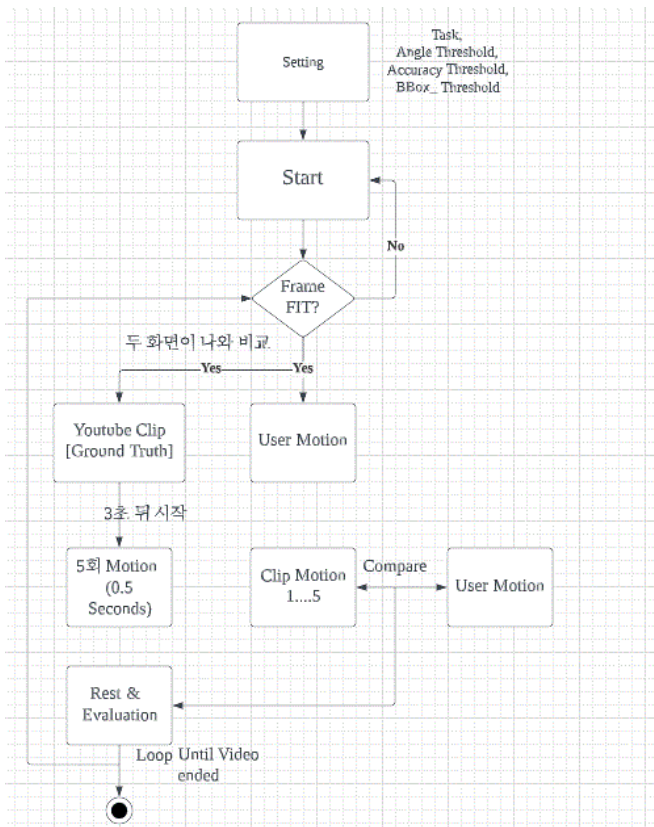
```
❗ Cannot resolve symbol 'mediapipe' :17
❗ Cannot resolve symbol 'mediapipe' :18
❗ Cannot resolve symbol 'mediapipe' :19
❗ Cannot resolve symbol 'mediapipe' :20
❗ Cannot resolve symbol 'mediapipe' :21
❗ Cannot resolve symbol 'mediapipe' :22
❗ Cannot resolve symbol 'mediapipe' :23
❗ Cannot resolve symbol 'mediapipe' :24
❗ Cannot resolve symbol 'mediapipe' :25
❗ Cannot resolve symbol 'mediapipe' :26
❗ Cannot resolve symbol 'mediapipe' :27
❗ Cannot resolve symbol 'mediapipe' :28
❗ Cannot resolve symbol 'CameraHelper' :45
❗ Cannot resolve symbol 'CameraHelper' :45
❗ Cannot resolve symbol 'EdlManager' :63
```

Build successful을 하였음에도 sync error 가 나옴.

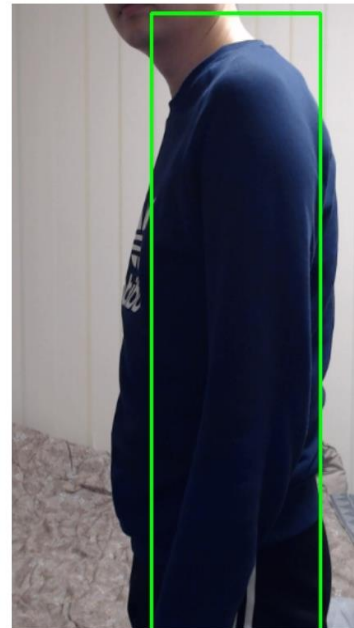
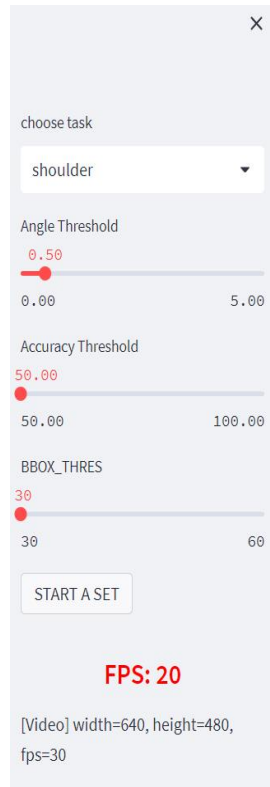


Sync Issue 확인하고 다시 설정 후 진행 test가 필요함

Web Architecture



Frame 안에 User가 들어오면
마스킹이 빨간색-> 초록색으로 변환하여
Ground Truth인 동영상 옆에 열린다.
그 후, 3초 Count 후 진행



Demo

choose task

shoulder

Inference frequency (IF)

115

Angle Threshold

3.50

1.5010.00

Box Padding

30

1545

☐ Left Arm?

☐ Do not start

START A SET

RESTART

FPS: 1

[Frame Index 100]
Angle(elbow, shoulder, hip)
match? True
Left: 26.4225 Right: 1.3757

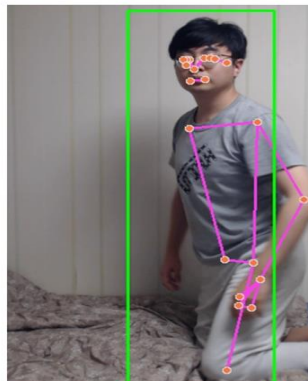
Rehabilitation Treatment Guide System

Please, first look at the following short video, then start to train!

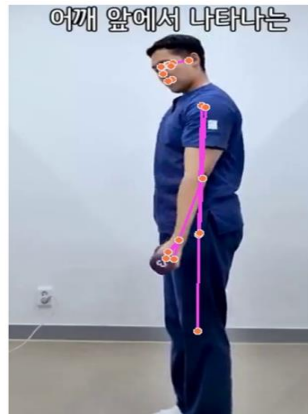
Arguments

- Inference frequency (IF)** : Infernece with MediaPipe Model for every IF number of frame
- Angle Threshold** : Threshold for allowance of error angle degree between USER and TARGET
- Box Padding** : Number of padding pixels to start based on TARGET person bounding box
- Left Arm** : Check if you want to train the left arm
- Do not start** : If you check this box, you will always not start the training program. For Debugging.

USER



TARGET



Count/Frame: 9 | Match Accuracy: 0.4286

Thank you