



## Overview

### Goal

Provide challenging image dataset to evaluate and improve the SOTA in 3D human pose and shape estimation

### Existing datasets limitation:

Method	Complex Clothing	Multi-Person	Occlusion	Full body GT
Human3.6M[1]	✗	✗	✗	✗
HUMBI [2]	✓	✗	✗	✓
3DPW [3]	✓	✓	✓	✗
EFT [4]	✓	✓	✓	✗
SMPLy [5]	✓	✓	✓	✗
AGORA	✓	✓	✓	✓

### AGORA preparation

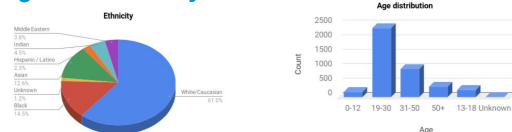
- fitted 4240 SMPL-X [7] to commercial scans with high accuracy of 5mm shape error
- render 5-15 scans per image using Unreal Engine
- used image based lighting and 3D environment
- span 350 unique subjects; include 257 kid scans

## AGORA



- 14529 training and 1225 validation images with corresponding masks and SMPL-X [7]/SMPL [8] fits
- 3387 test images with web-based evaluation server
- 173K individual person crops in total

### Age and Ethnicity



- finetuning SPIN [9] with AGORA training images improves MPJPE by 12% for 3DPW [3] and ~13% for AGORA
- improved accuracy on 3DPW (natural image dataset) confirms the realism of AGORA

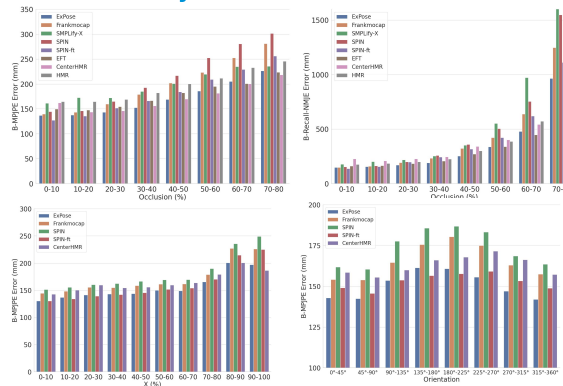
## Baseline Evaluation

Method	MPJPE ↓				MVE ↓				NMJE ↓		NMVE ↓		F1 score ↑	
	B	LH/RH	F	FB	B	LH/RH	F	FB	B	FB	B	FB		
SMPL	HMR [8]	180.5	N/A	N/A	N/A	173.6	N/A	N/A	N/A	226.0	N/A	217.0	N/A	0.80
	CenterHMR [10]	168.1	N/A	N/A	N/A	161.4	N/A	N/A	N/A	242.3	N/A	233.9	N/A	0.69
	EFT [4]	165.4	N/A	N/A	N/A	159.0	N/A	N/A	N/A	203.6	N/A	196.3	N/A	<b>0.81</b>
	SPIN [9]	175.1	N/A	N/A	N/A	168.7	N/A	N/A	N/A	223.1	N/A	216.3	N/A	0.78
	SPIN-ft (ours)	<b>153.4</b>	N/A	N/A	N/A	<b>148.9</b>	N/A	N/A	N/A	<b>199.2</b>	N/A	<b>193.4</b>	N/A	0.77
SMPL-X	SMPLify-X [7]	182.1	<b>46.5/49.6</b>	<b>52.9</b>	231.8	187.0	<b>48.3/51.4</b>	<b>48.9</b>	236.5	256.5	326.5	263.3	333.1	0.71
	ExPose [11]	<b>150.4</b>	72.5/68.8	55.2	<b>215.9</b>	<b>151.5</b>	74.9/71.3	51.1	<b>217.3</b>	<b>183.4</b>	<b>263.3</b>	<b>184.8</b>	<b>265.0</b>	<b>0.82</b>
	Frankmocap [12]	165.2	52.3/53.1	N/A	N/A	168.3	54.7/55.7	N/A	N/A	204.0	N/A	207.8	N/A	0.81

### Evaluation Metric and Protocol:

- TP, FP and FN are detected by matching the projected GT and prediction keypoints
- MPJPE/MVE: pelvis-aligned joint and vertex error
- NMJE/NMVE to facilitate multiperson 3DHPs analysis
- $NMJE \text{ or } NMVE = (MPJPE \text{ or } MVE) / F1$
- Low NMJE/NMVE → low false positive and misses
- SMPL-X evaluated on body(B), faces(F) and hand(LH/RH) individually and together (FB)
- $FB = B + (LH + RH + F) / 3$

## Baseline Analysis



### Conclusion:

- high occlusion leads to high MPJPE error and high misses
- methods that miss lots of people suffer under recall NMJE

### Distance from center:

- weak perspective cameras assumption by baselines
- error increase for off-center people in the image for large fov images

### Orientation:

- error increase for people facing opposite to the camera

## Baseline Finetuning

Models	3DPW (14)		3DPW (24)		AGORA (24)	
	MPJPE	PA-MPJPE	MPJPE	PA-MPJPE	MPJPE	MPJPE
SPIN-pt	96.9	59.3	95.5	65.5	175.1	
SPIN-ft (ours)	<b>85.7</b>	<b>55.3</b>	<b>83.7</b>	<b>61.8</b>	<b>153.4</b>	

## References

- Human3.6M; Ionescu et al., TPAMI 2014.
- HUMBI; Yu et al., CVPR 2020.
- 3DPW; von Marcard et al., ECCV 2018.
- EFT; Joo et al., arXiv 2020.
- SMPLy; Leroy et al., 3DV 2020.
- HMR; Kanazawa et al., CVPR 2018.
- SMPLify-X; Pavlakos et al., CVPR 2019.
- SMPL; Loper et al., SIGGRAPH Asia 2015.
- CenterHMR; Sun et al., arXiv 2020.
- SPIN; Kolotouros et al., ICCV 2019.
- ExPose; Choutas et al., ECCV 2020.
- FrankMocap; Rong et al., arXiv 2020.