



Keep it SMPL: Automatic Estimation of 3D Human Pose and Shape from a Single Image

MAX-PLANCK-GESELLSCHAFT



Microsoft



Federica Bogo*

Angjoo Kanazawa*

Christoph Lassner

Peter Gehler

Javier Romero

Michael J. Black

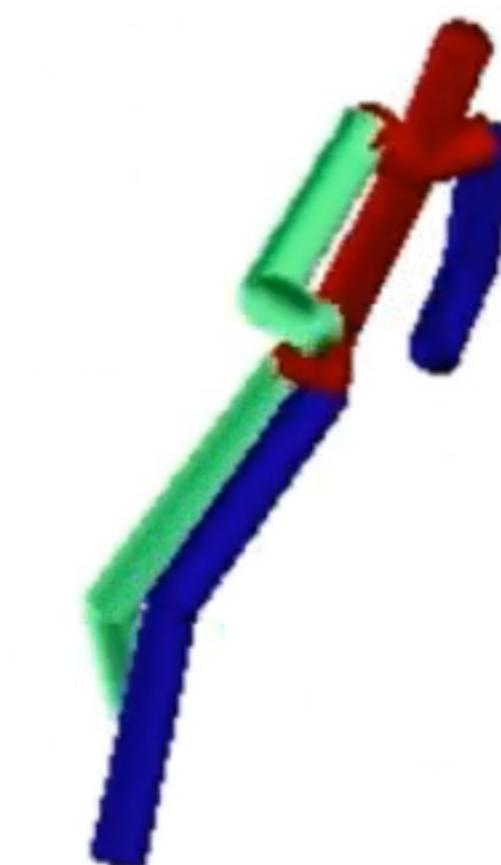
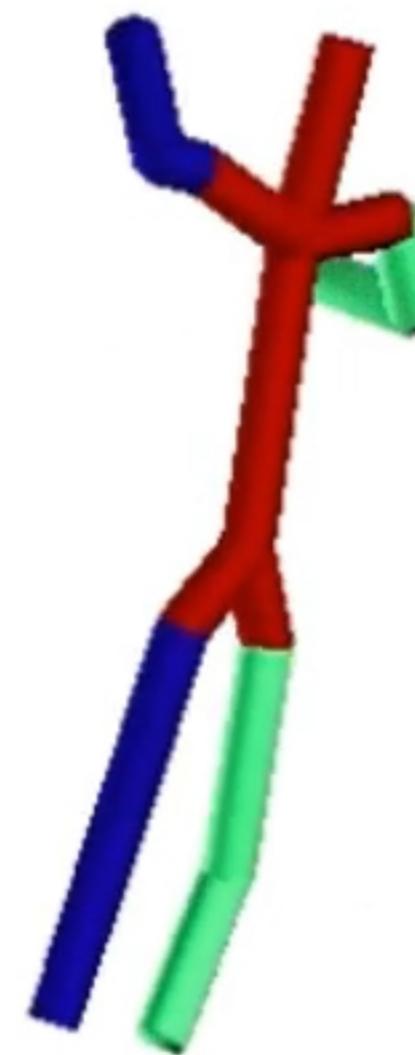
* Equal contribution

All the work was performed at MPI

3D shape and pose from a single image



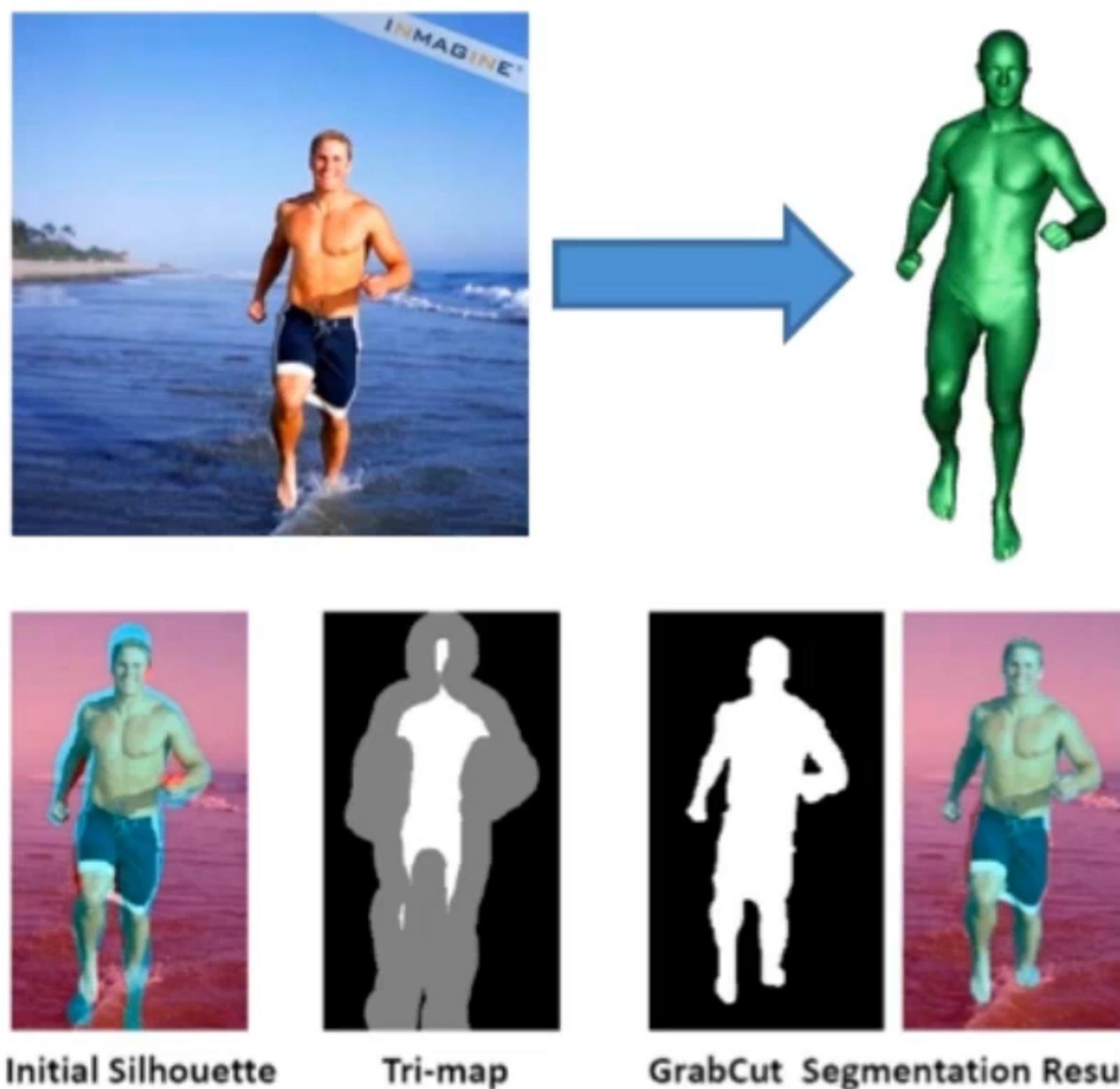
3D Pose Estimation



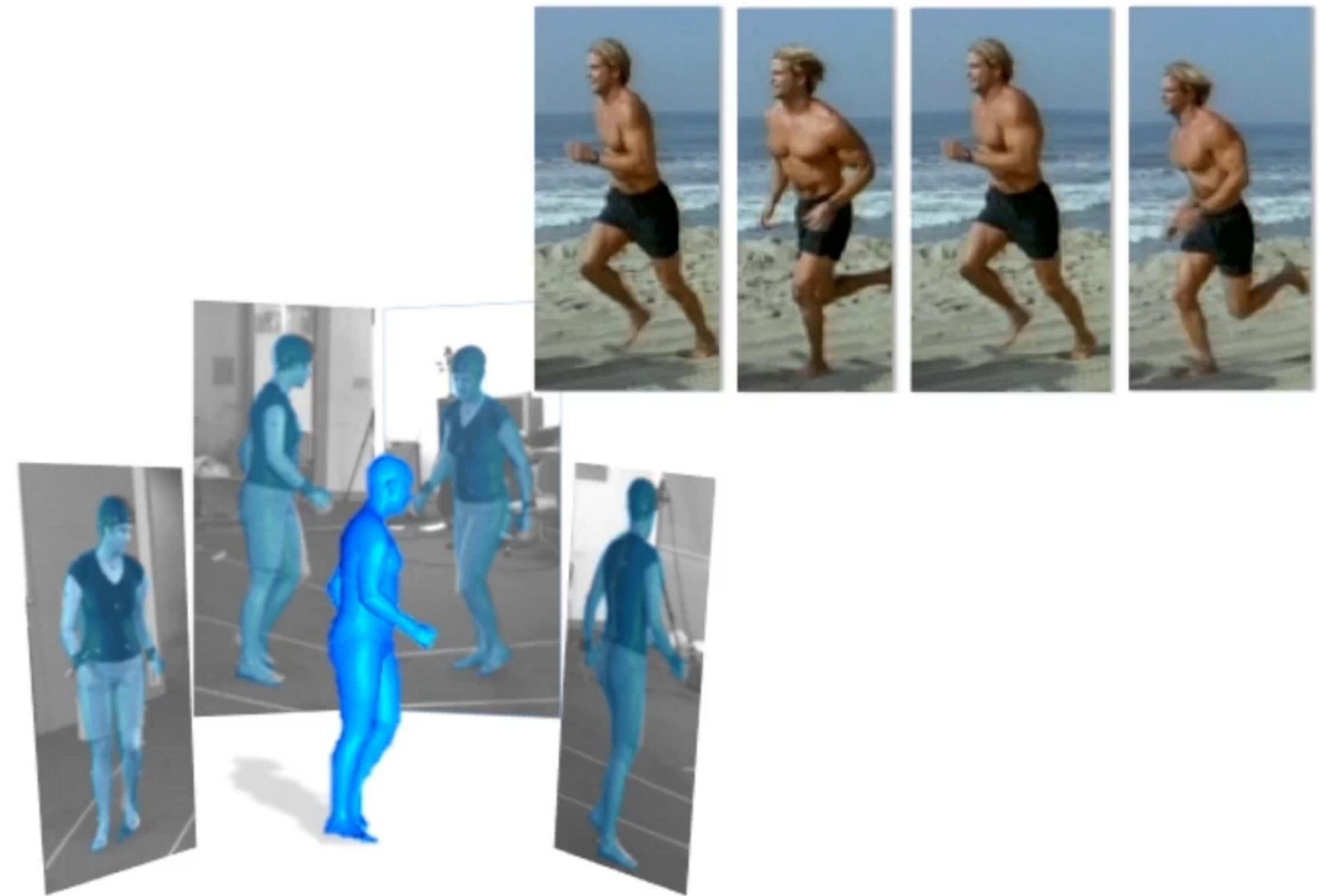
[Zhou CVPR '15]

Pose and Shape, but ...

Manual Intervention



Multiview, Sequence



[Guan et al. ICCV '09, Hasler et al. CVPR '10,
Zhou et al. SIGGRAPH '10]

[Bălan et al. CVPR '07, Jain et al. SIGGRAPH '10,
Rhodin et al. ECCV '16]

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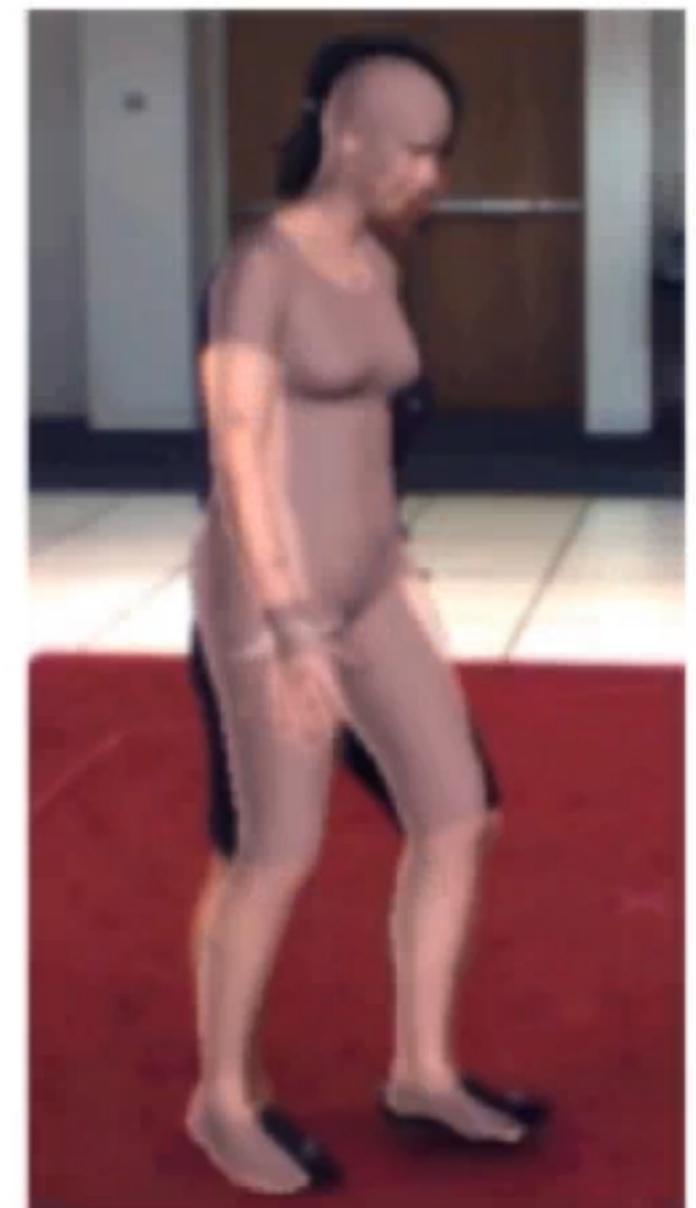
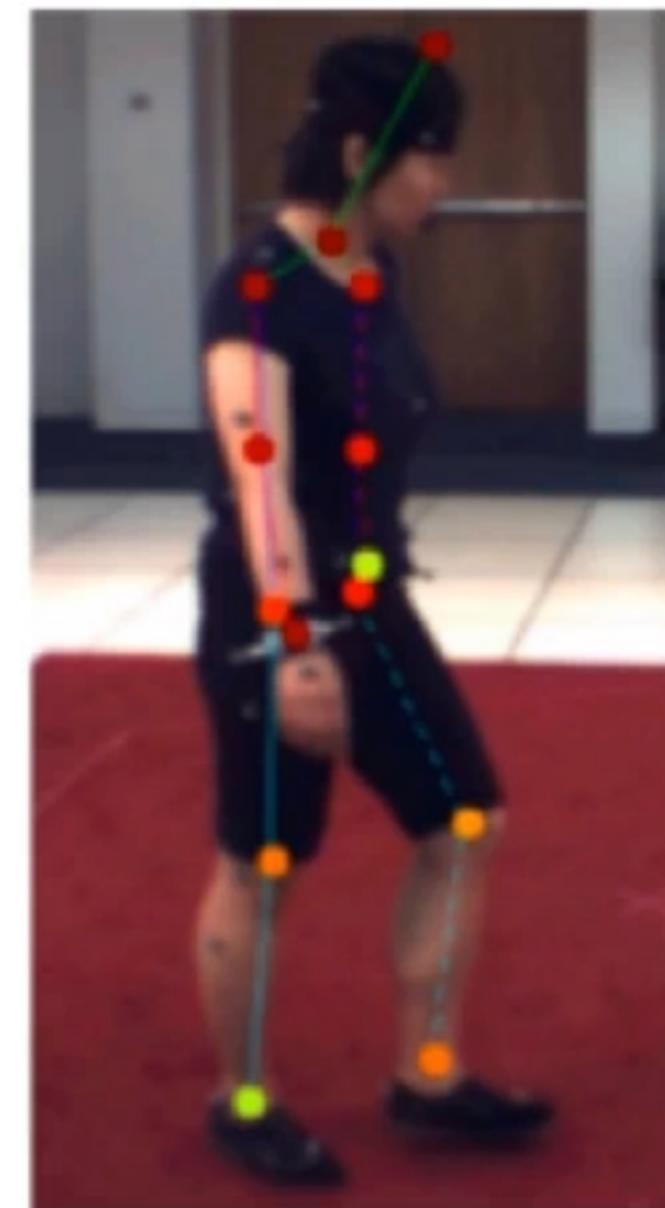
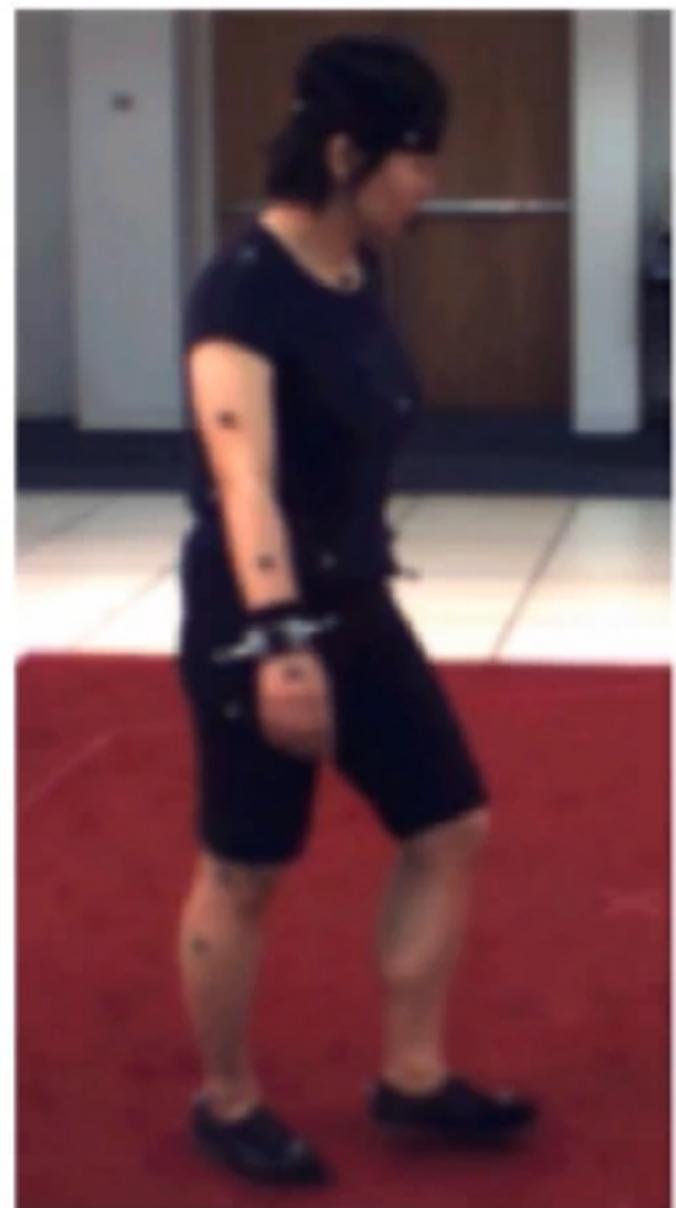
[Bălan et al. CVPR '07, Jain et al. SIGGRAPH '10,
Rhodin et al. ECCV '16]

Our results



Overview

1. Automatic joint detection via CNNs
2. A good generative model of 3D pose and shape



SMPL
(Skinned Multi-Person Linear Model)

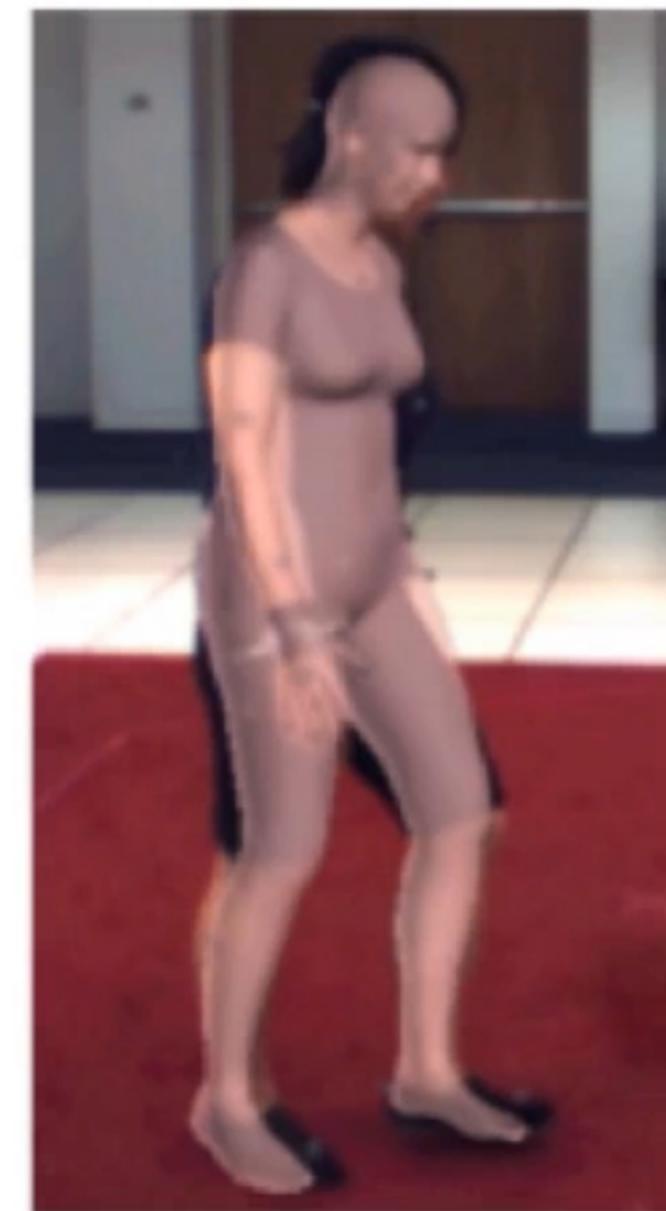
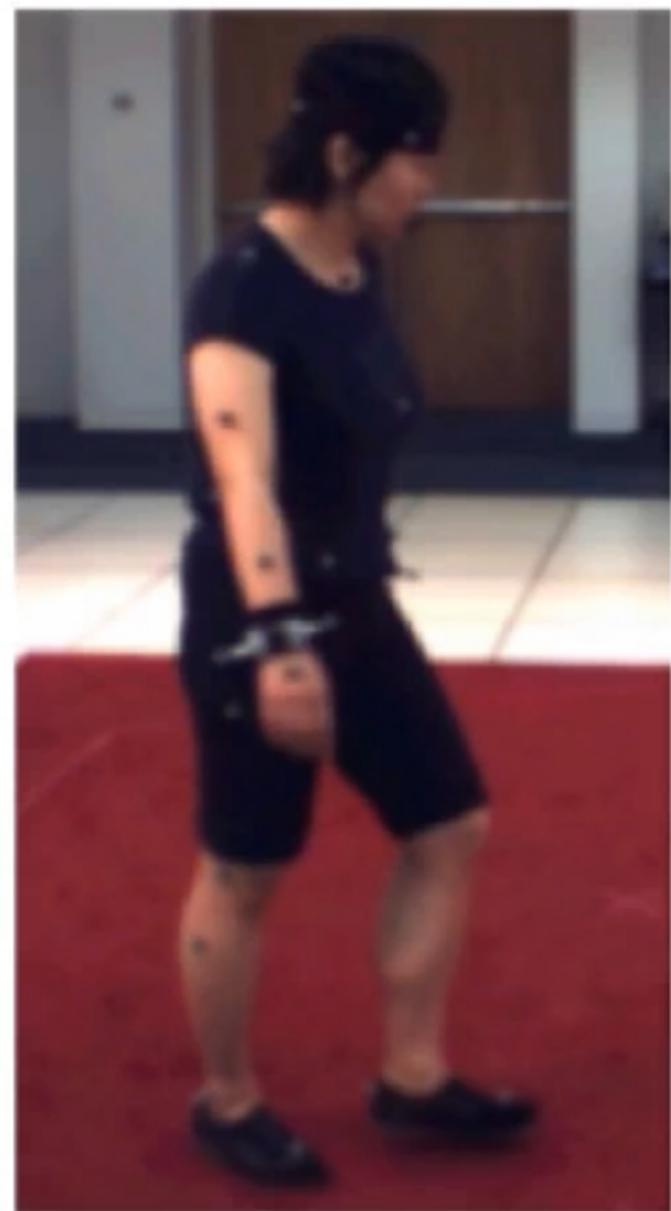
Overview

1. Automatic joint detection via CNNs

BOTTOM UP

2. A good generative model of 3D pose and shape

TOP DOWN



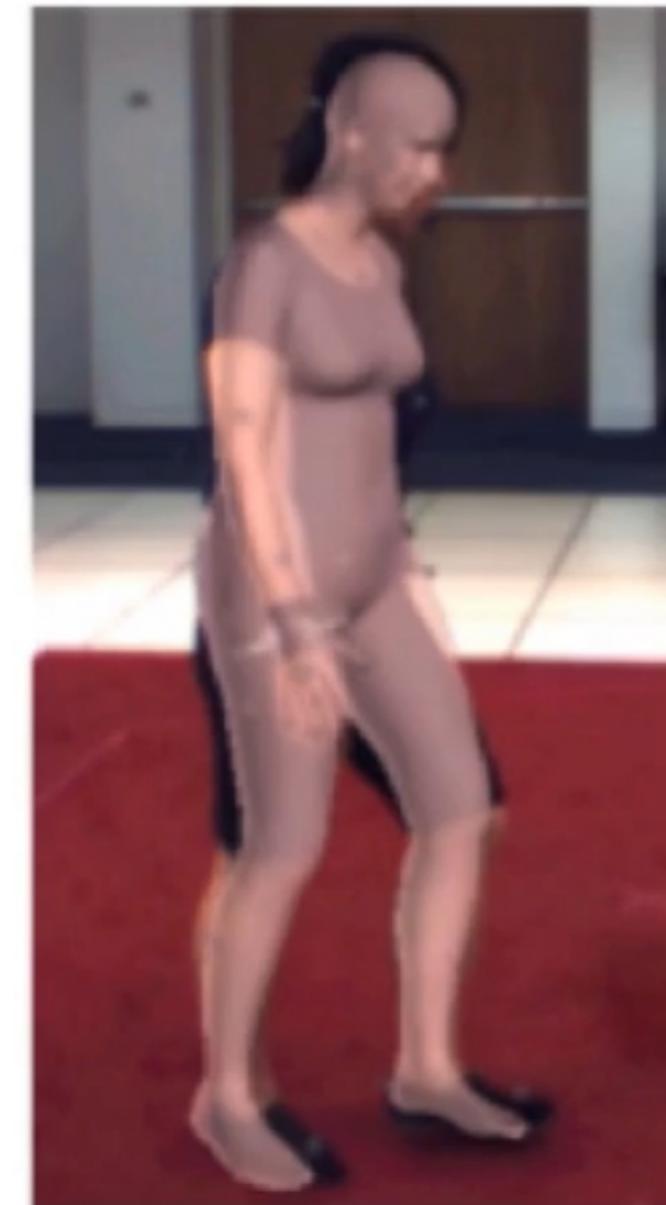
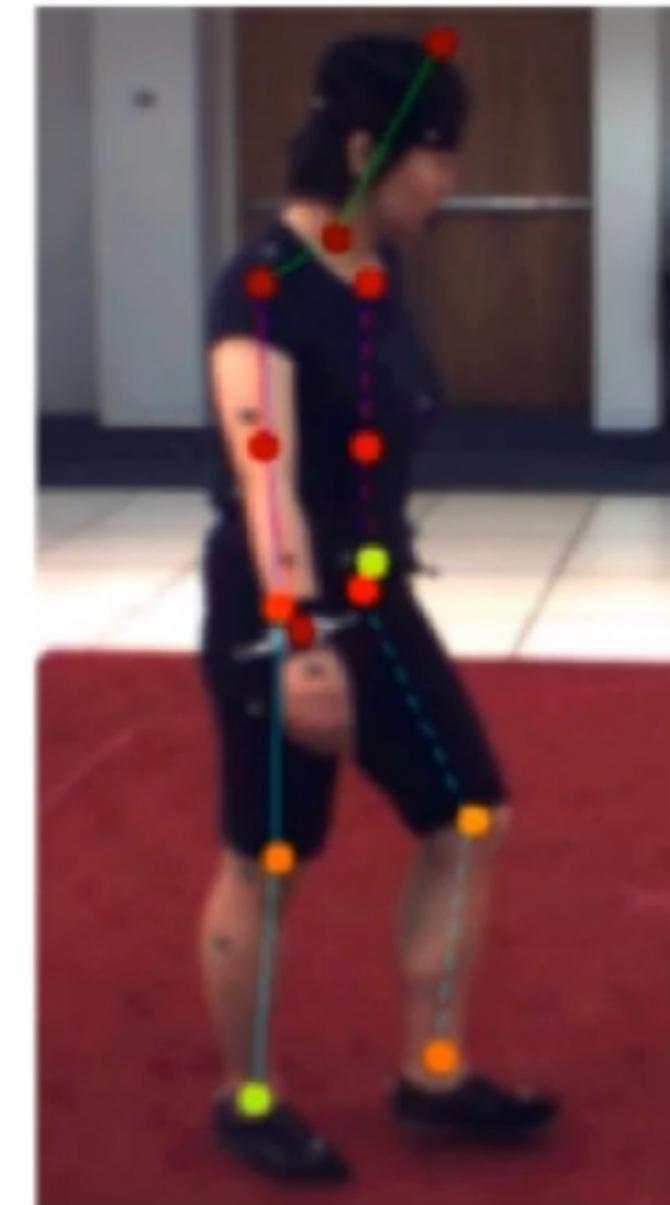
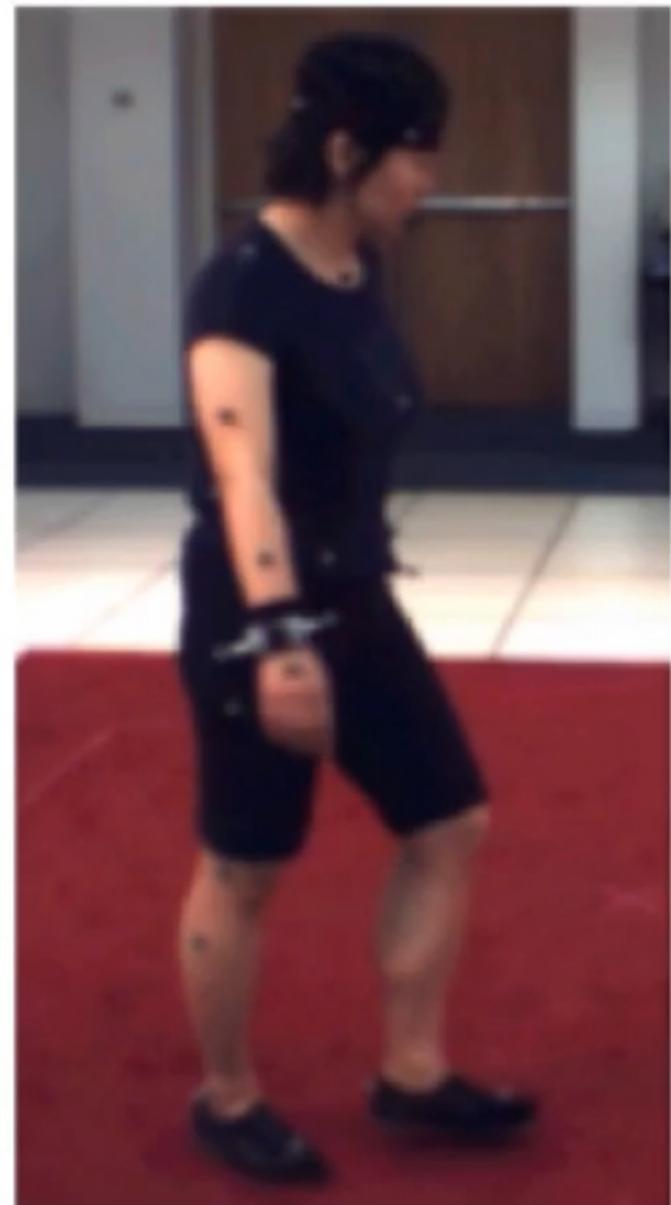
SMPLify

1. Automatic joint detection via CNNs

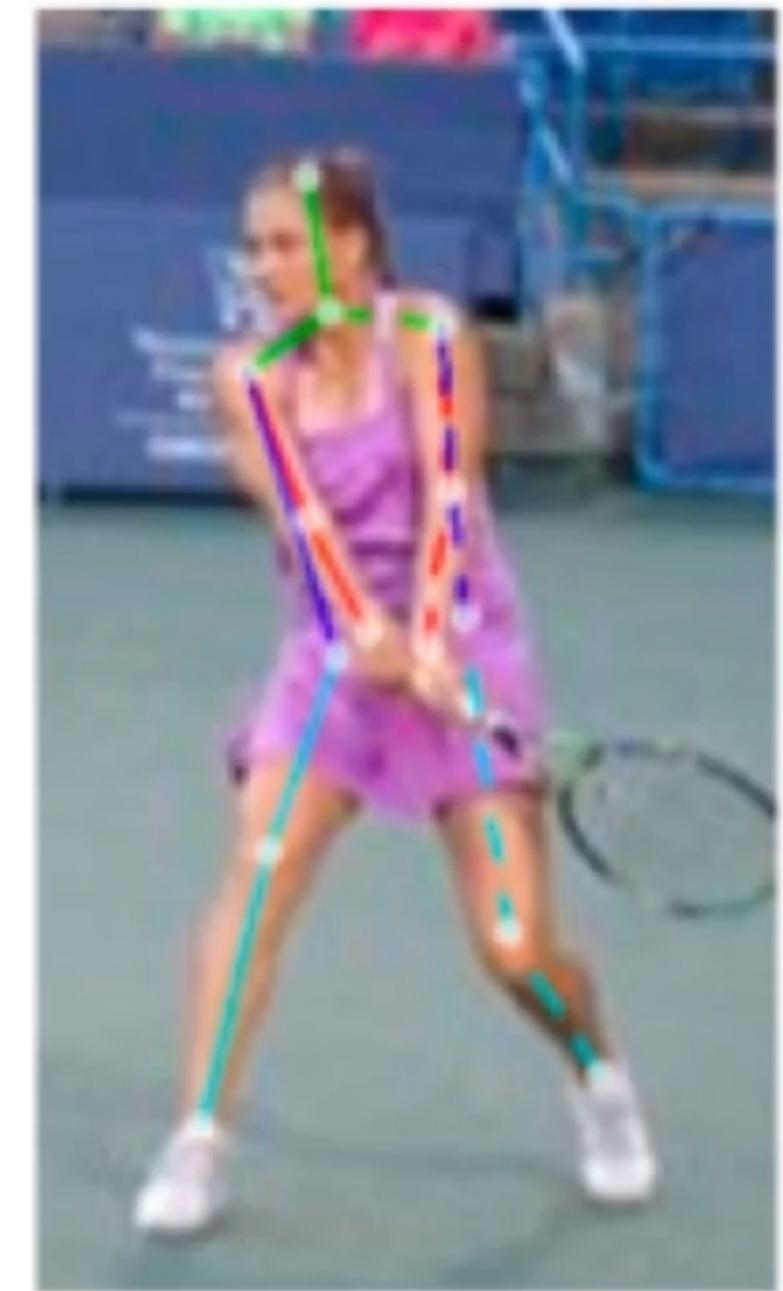
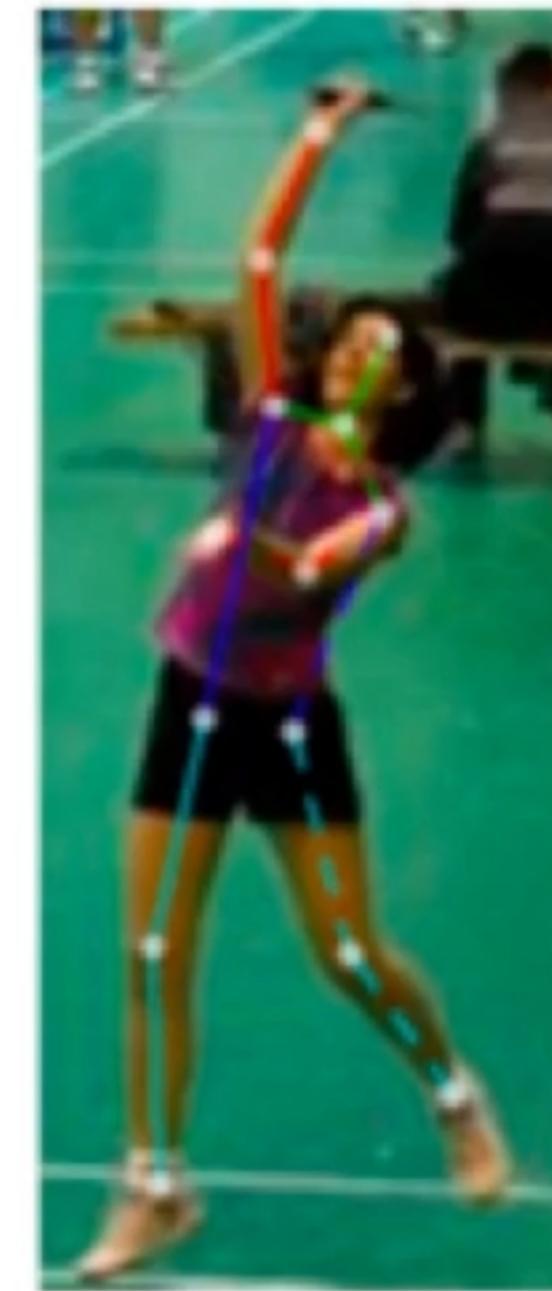
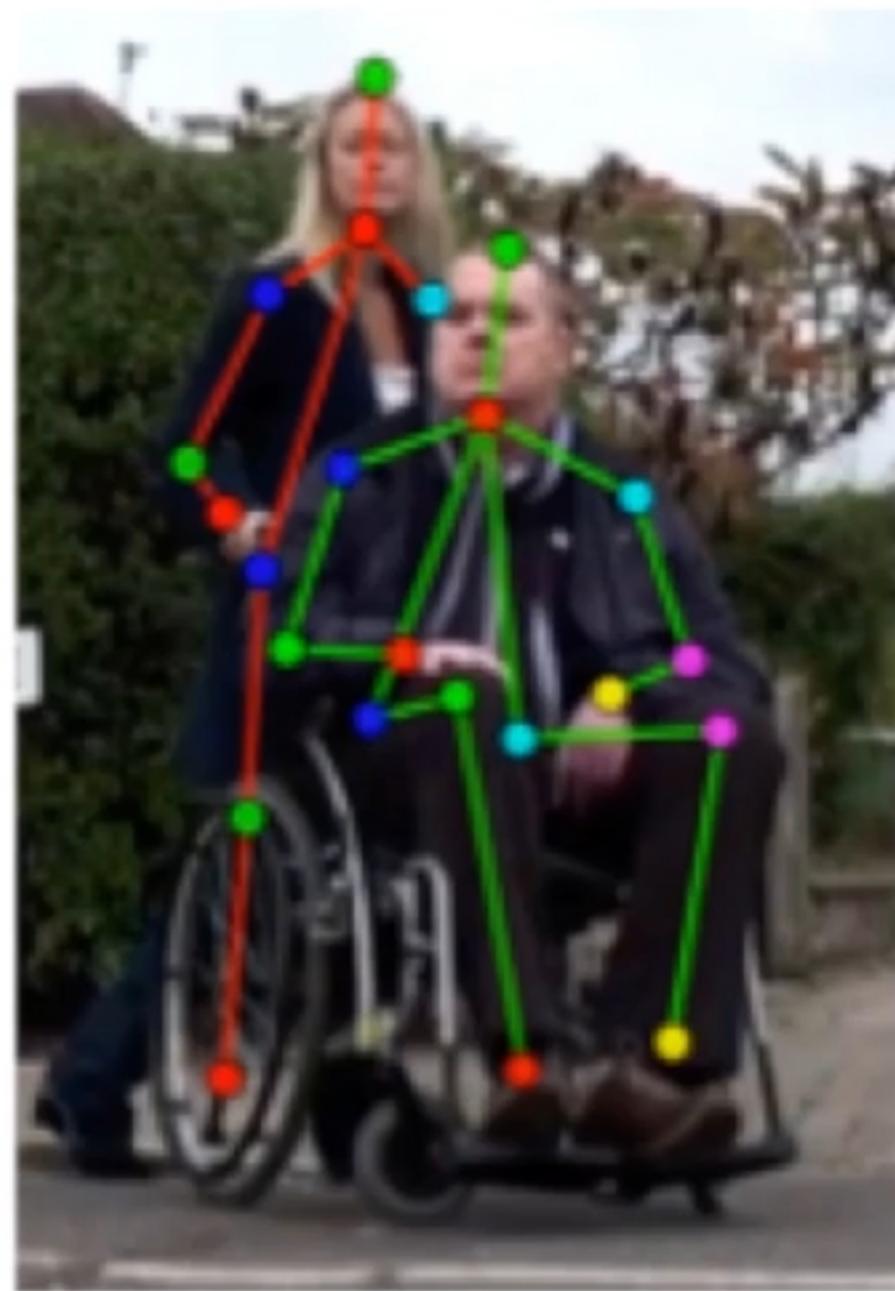
BOTTOM UP

2. A good generative model of 3D pose and shape

TOP DOWN



2D joint detection

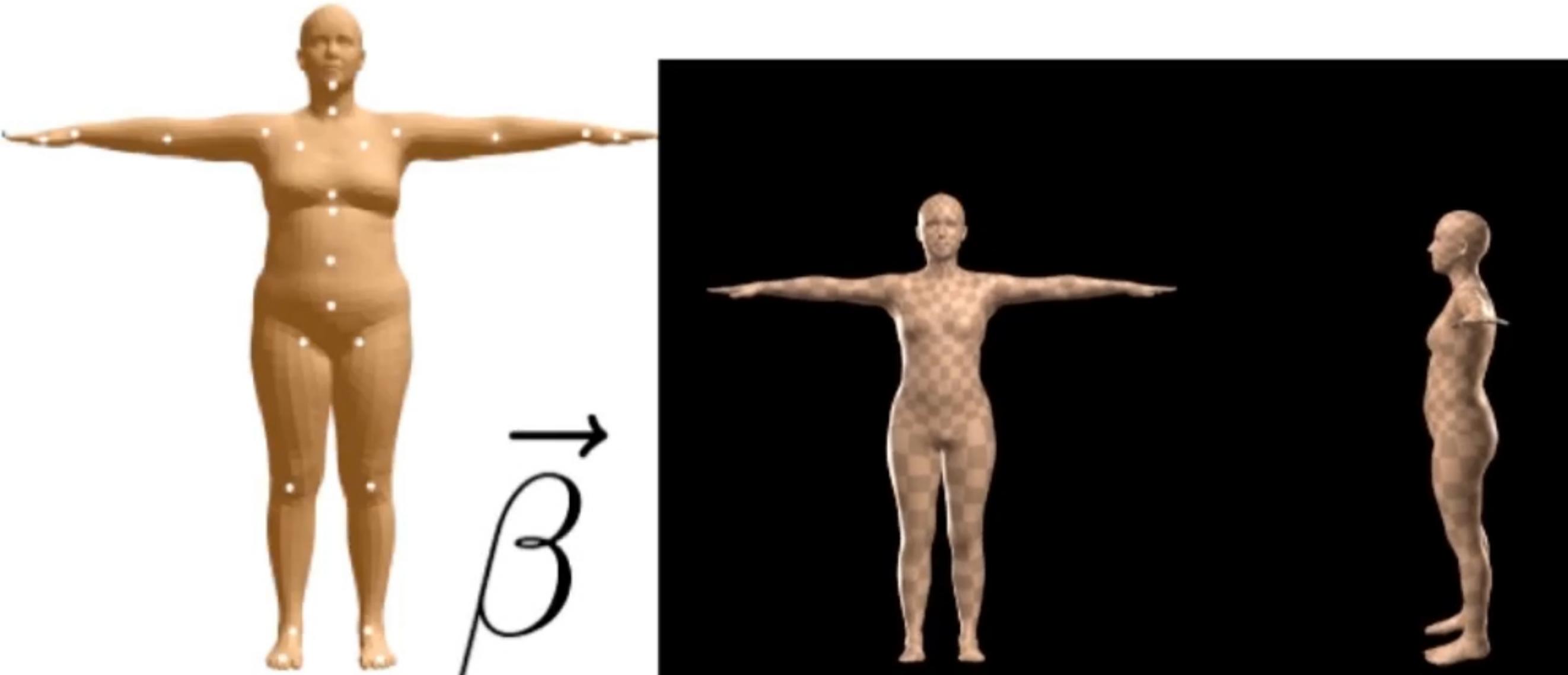


Supervised end-to-end training to detect joints with confidence values.

[Pishchulin et al. DeepCut CVPR 2016.]

SMPL body model

Shape: PCA coefficients



Pose: Rotation of 23 joints

SMPLify Objective Function

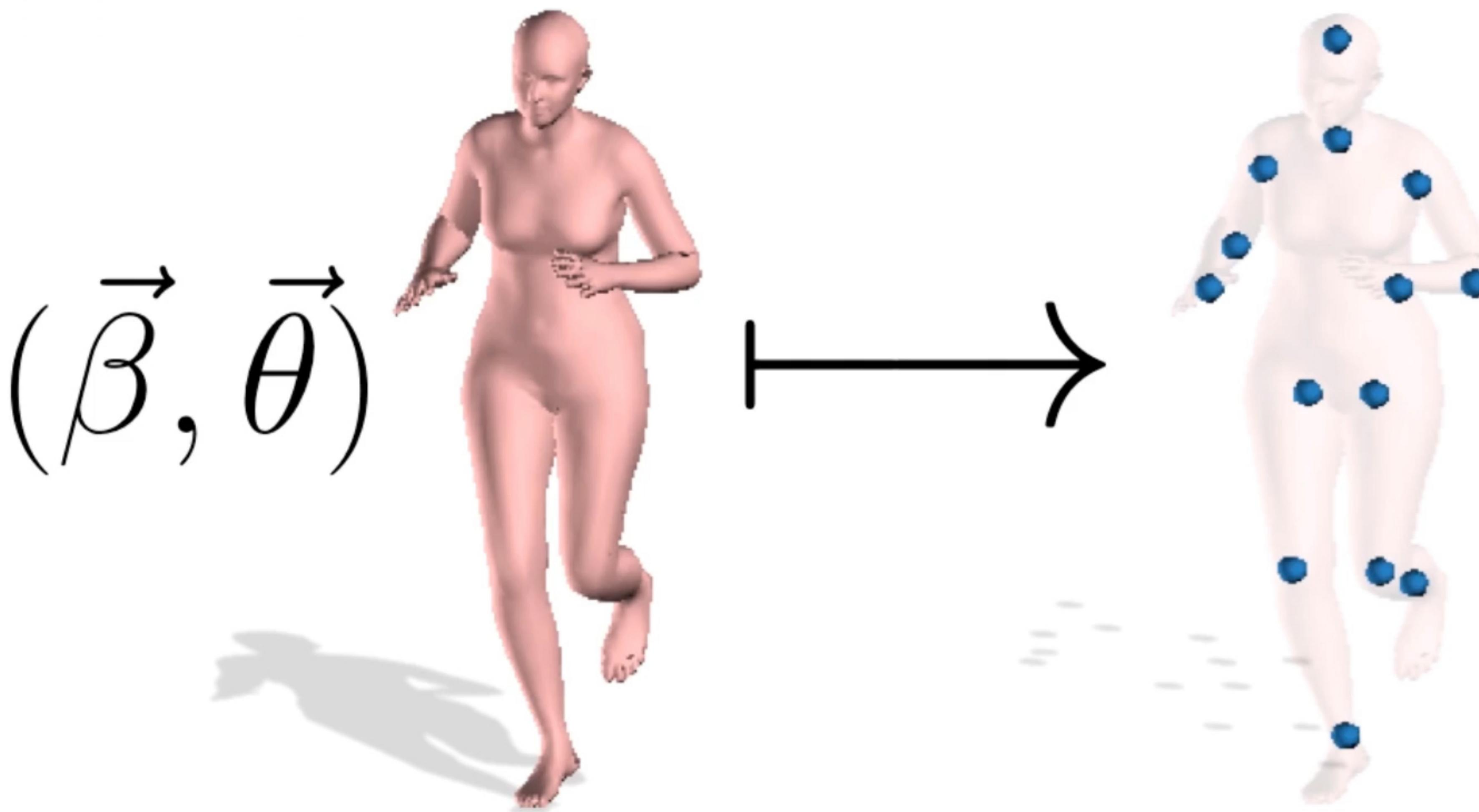


$$E(\vec{\beta}, \vec{\theta}, K; J_{est}) =$$

camera joints
 \ /

$$E_J(\vec{\beta}, \vec{\theta}, K; J_{est}) + E_a(\vec{\theta}) + E_\theta(\vec{\theta}) + E_{sp}(\vec{\theta}, \vec{\beta}) + E_\beta(\vec{\beta})$$

Data Term: Joint Projection Error



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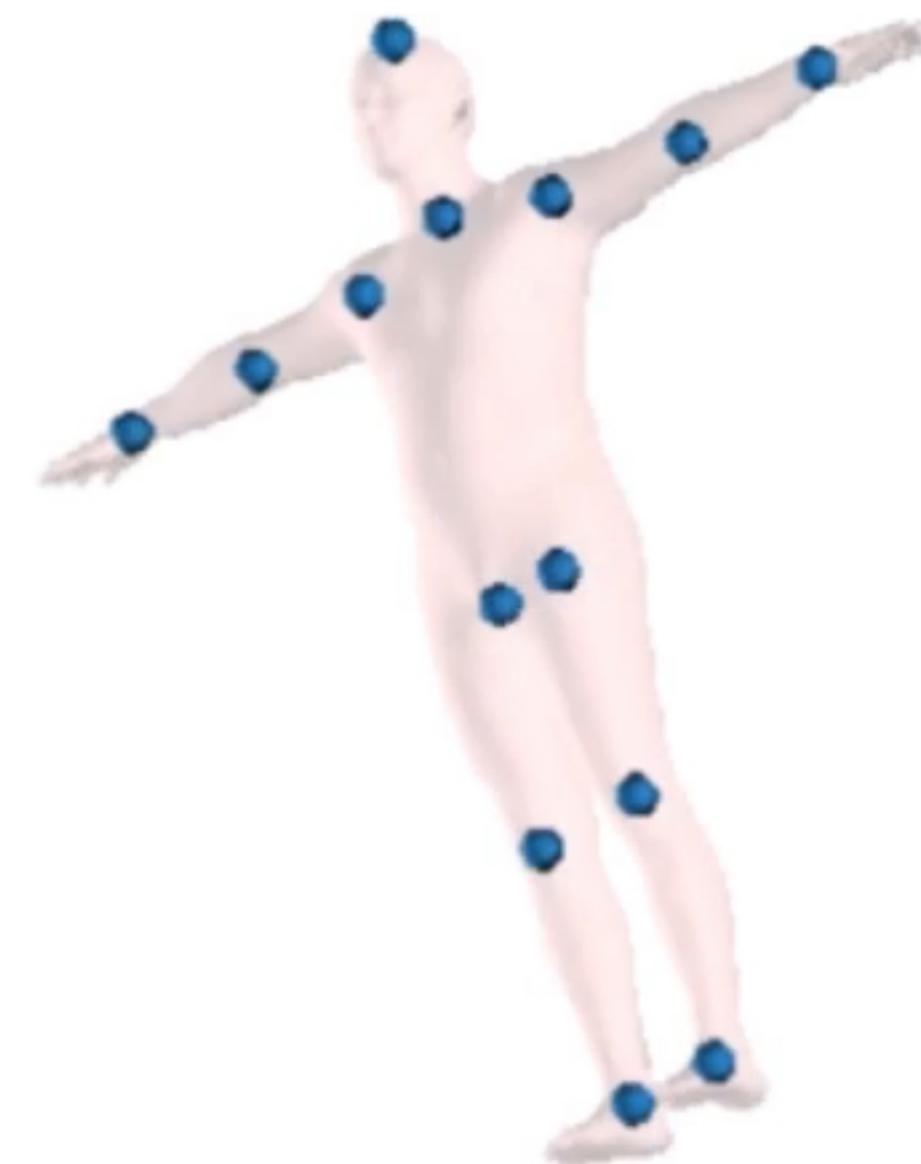
$$E_J(\vec{\beta}, \vec{\theta}, K; J_{est}) =$$

||



Camera Projection

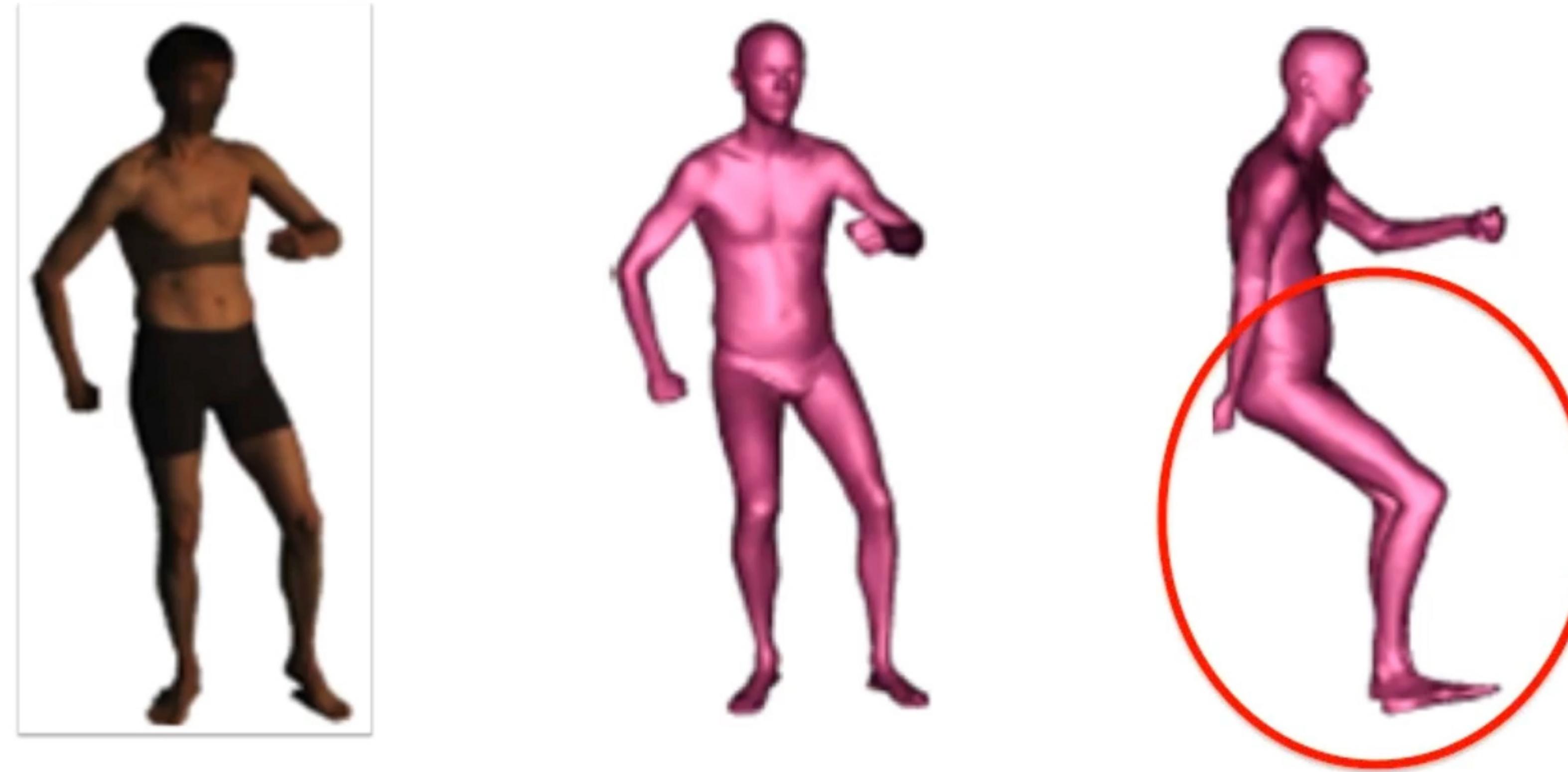
$$- \Pi_K ($$



$$)^2 ||_2^2$$

Depth Ambiguity

Side view



[Guan et al., Estimating human shape and pose from a single image. ICCV 2009.]

Pose and shape priors



$$E_{\theta}(\vec{\theta})$$

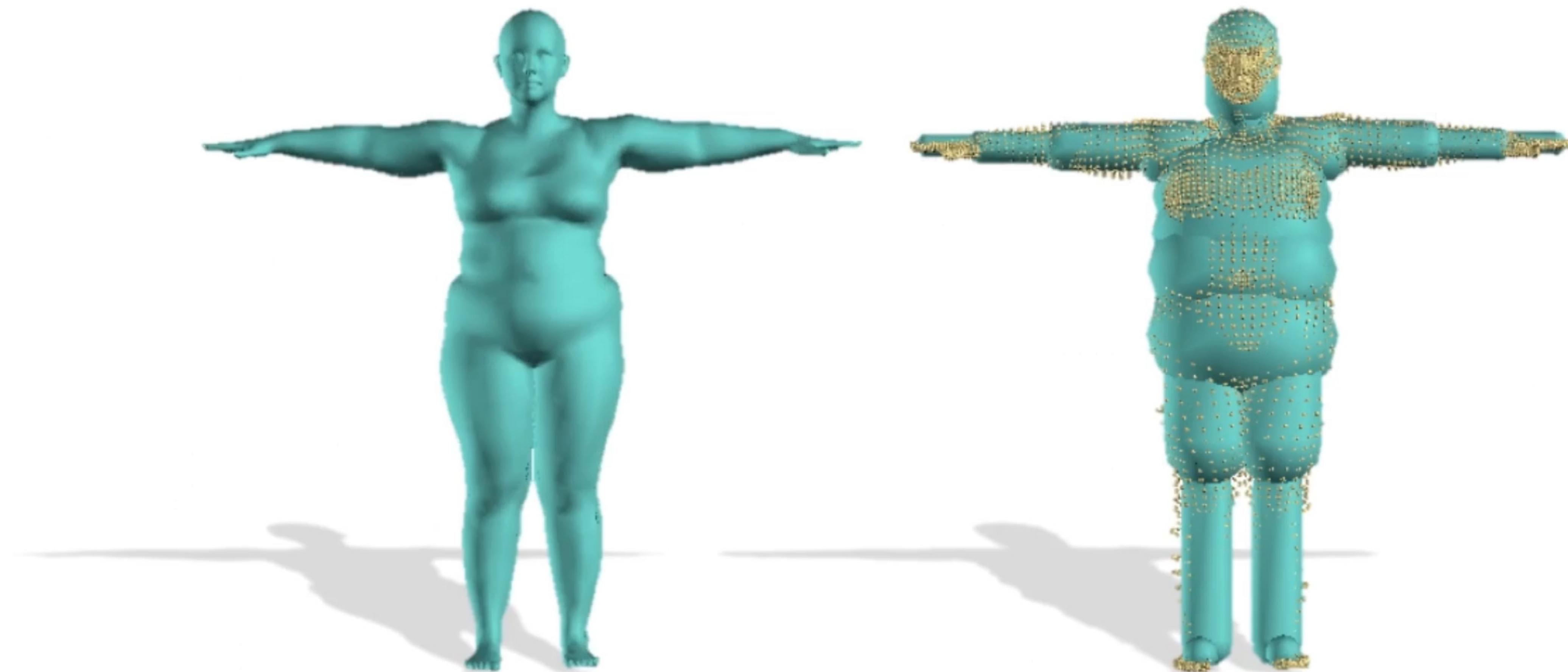
Pose Prior



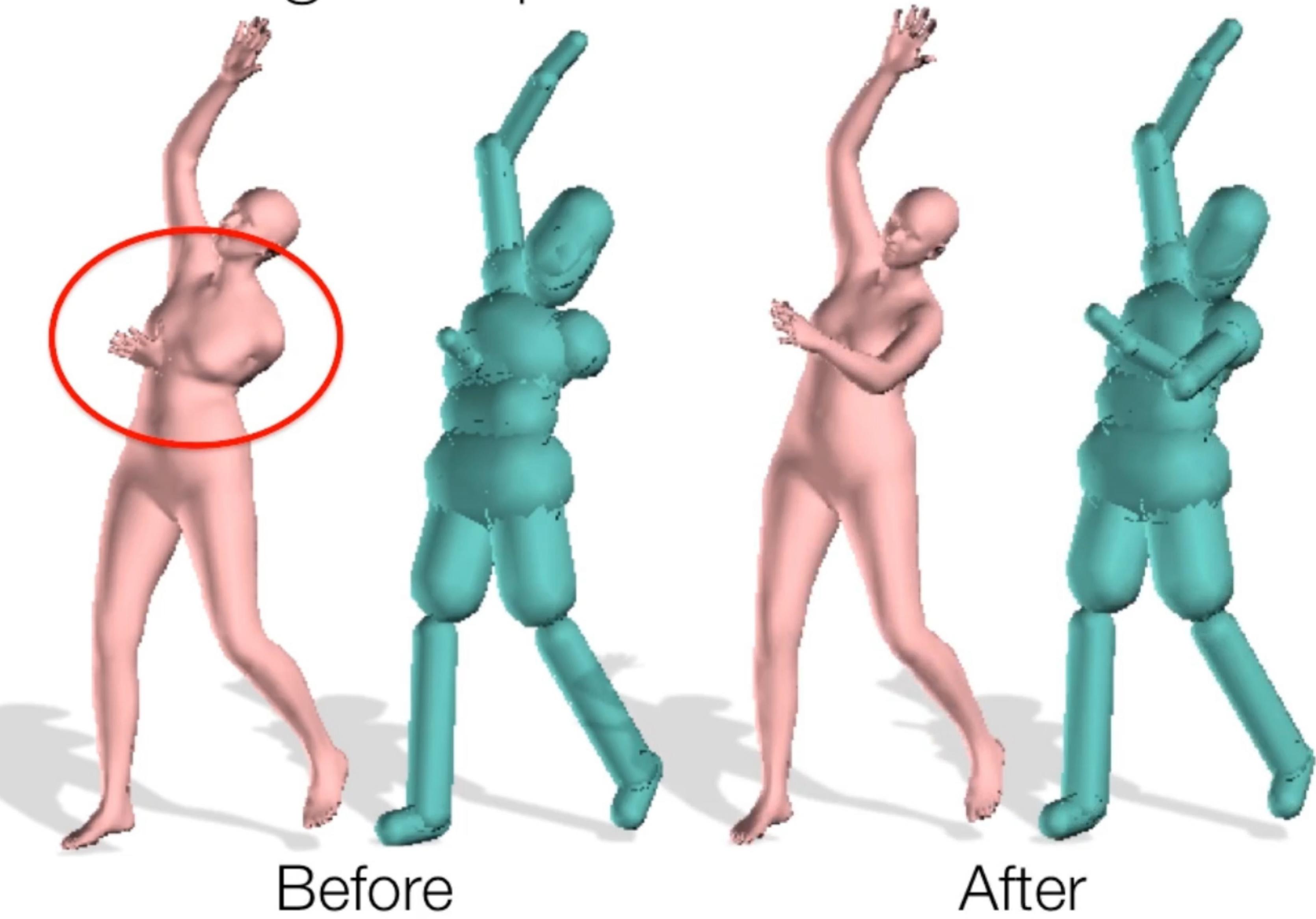
$$E_{\beta}(\vec{\beta})$$

Shape Prior

Preventing interpenetration



Preventing interpenetration



SMPLify Objective Function



$$E(\vec{\beta}, \vec{\theta}, K; J_{est}) =$$

$$E_J(\vec{\beta}, \vec{\theta}, K; J_{est}) + E_a(\vec{\theta}) + E_\theta(\vec{\theta}) + E_{sp}(\vec{\theta}, \vec{\beta}) + E_\beta(\vec{\beta})$$

pose and shape priors

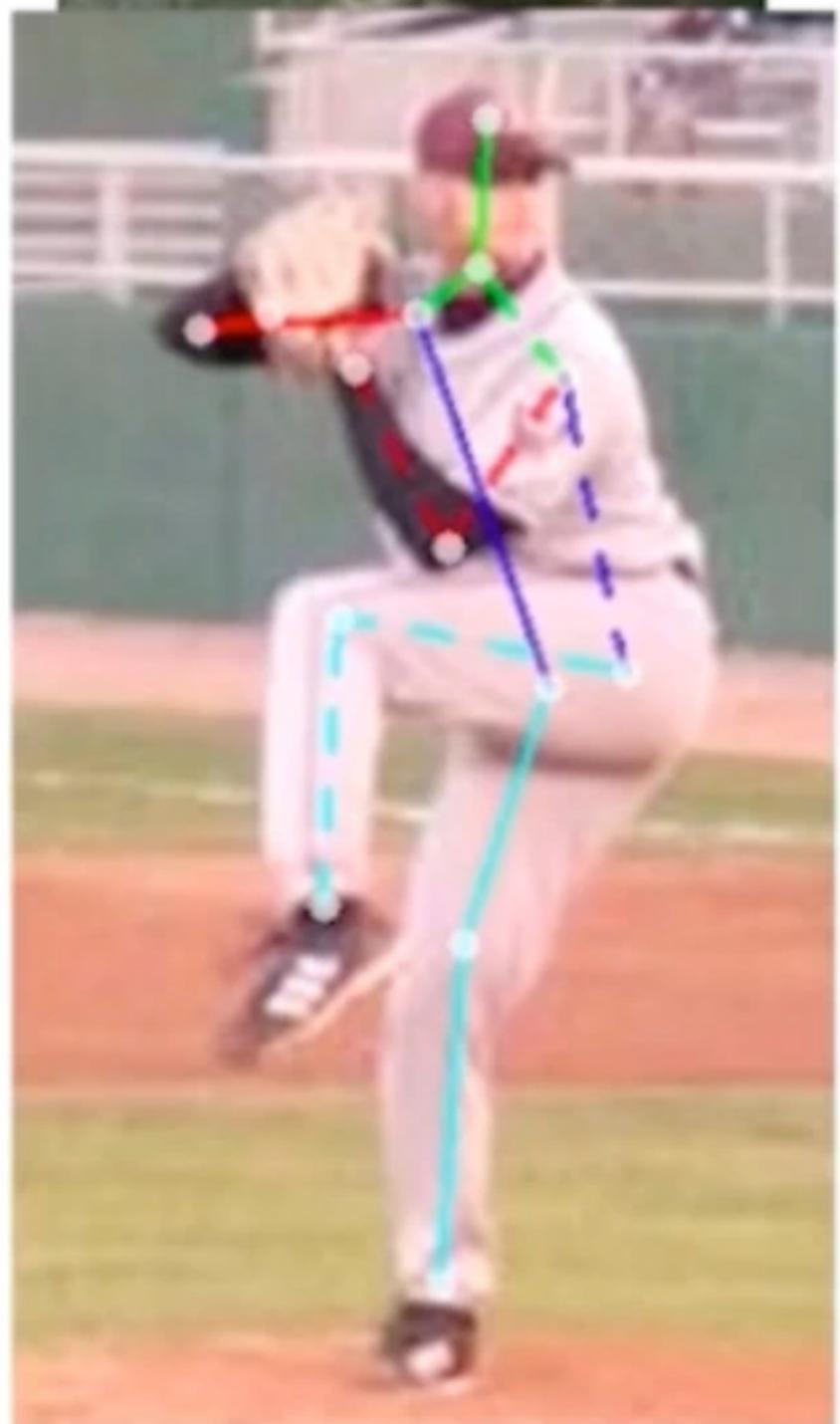
Joint projection error

interpenetration

Results on Leeds Sports Poses (LSP)

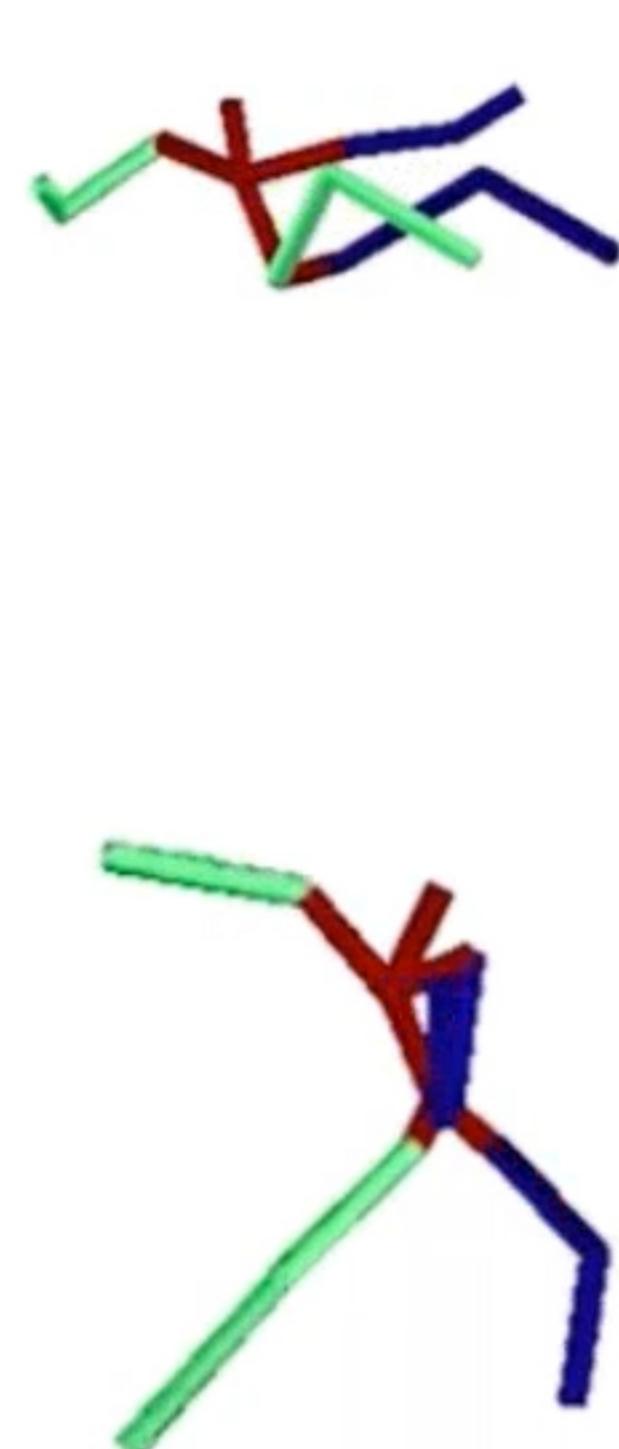


Results on Leeds Sports Poses (LSP)

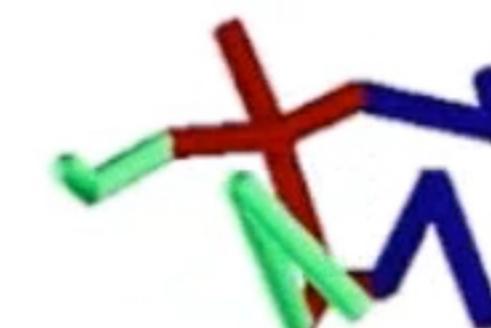


Input

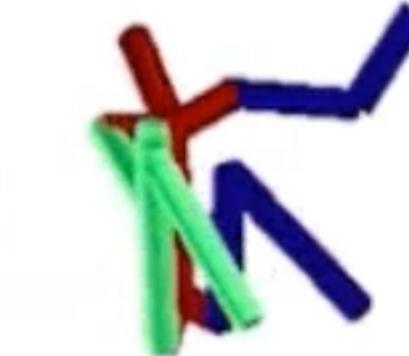
Ahkter et al
CVPR '15



Ramakrishna et al
ECCV '12



Zhou et al
CVPR '15



SMPLify



Quantitative Evaluation

Mean error:

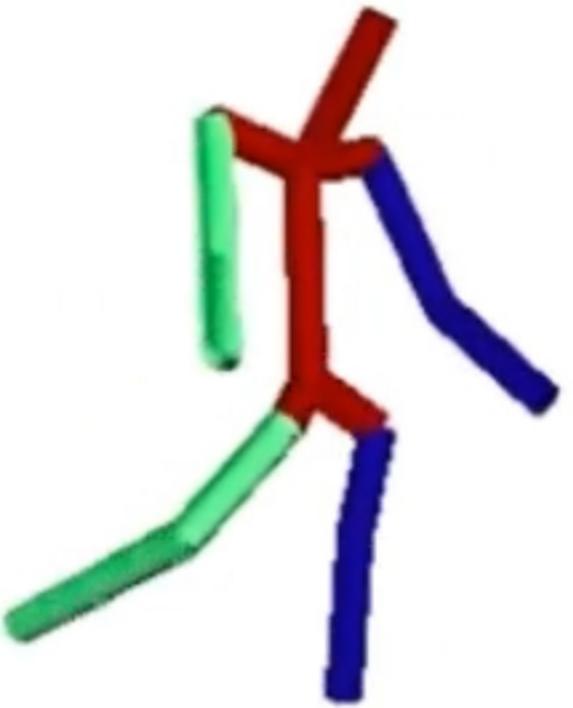
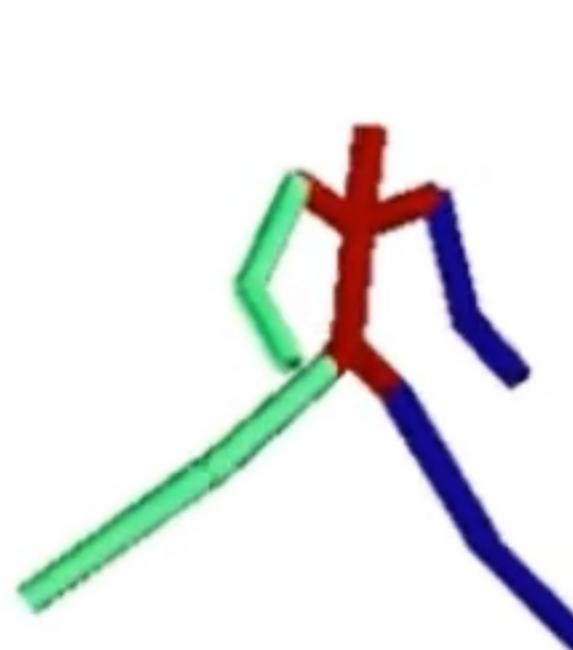
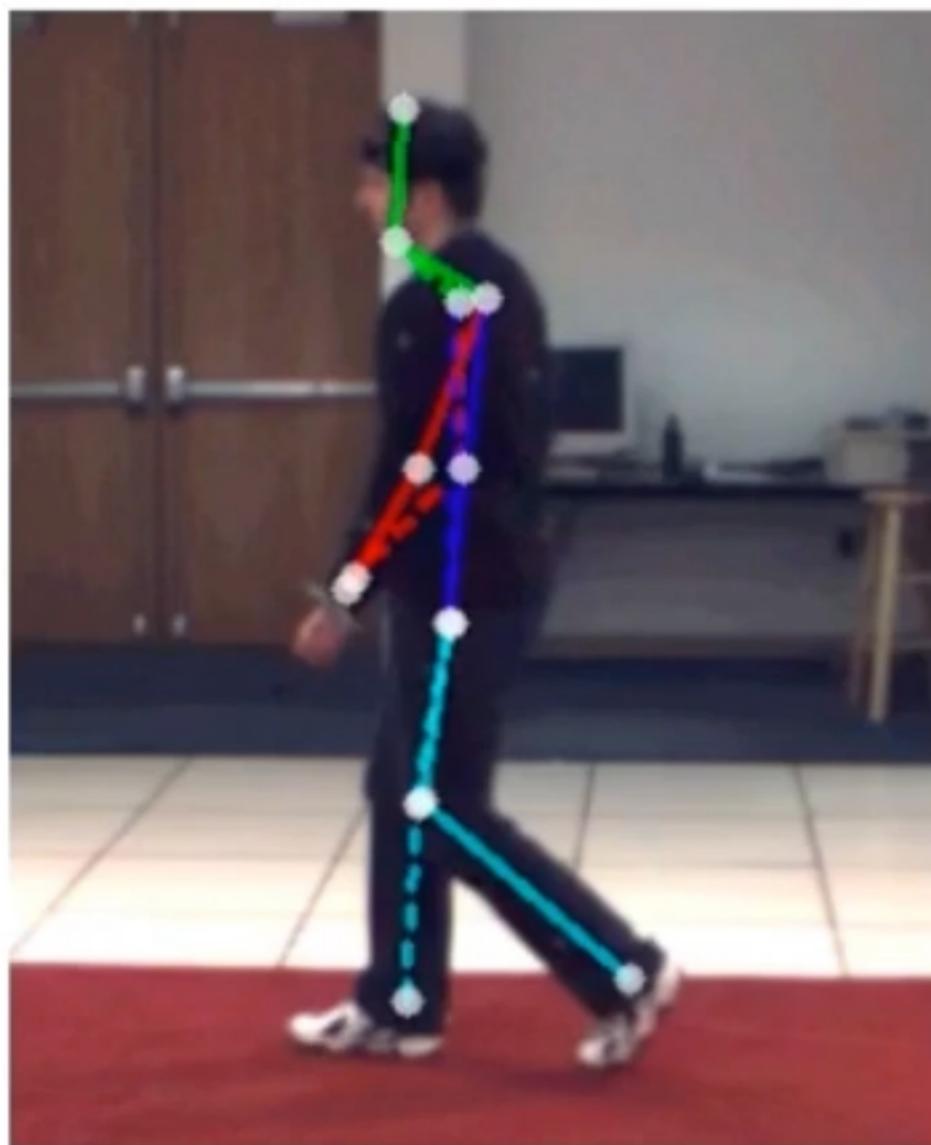
181mm

157mm

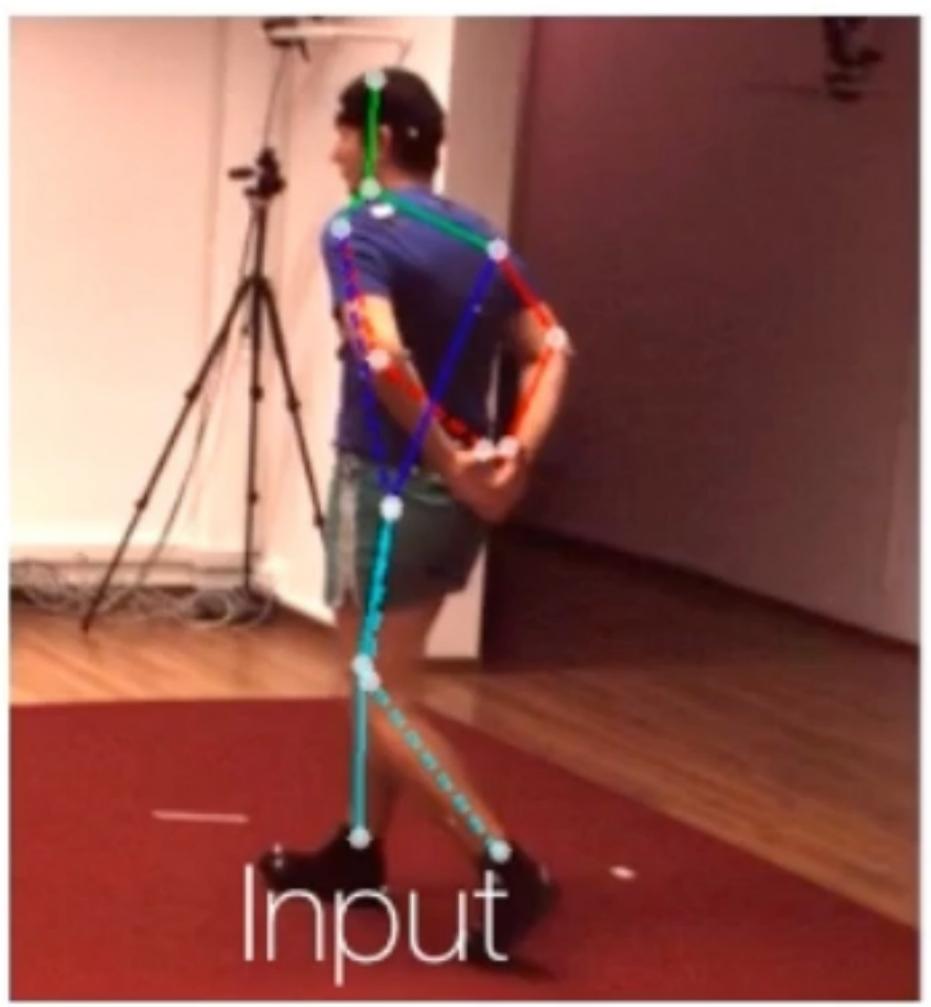
106mm

82mm

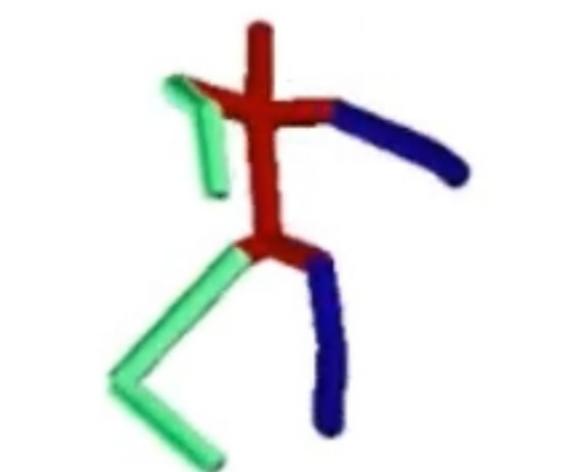
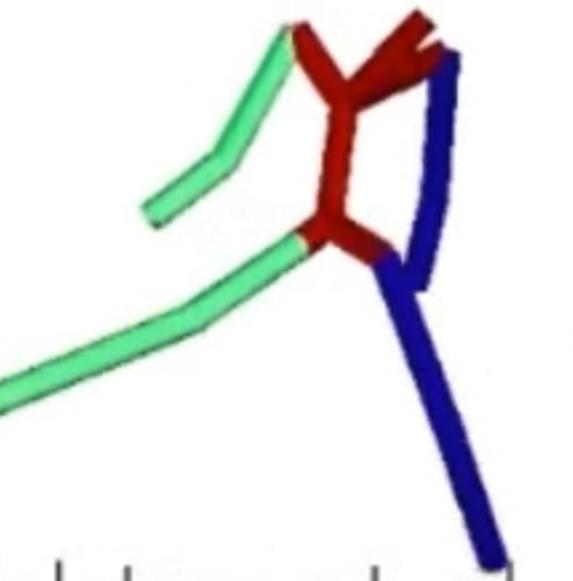
HumanEva



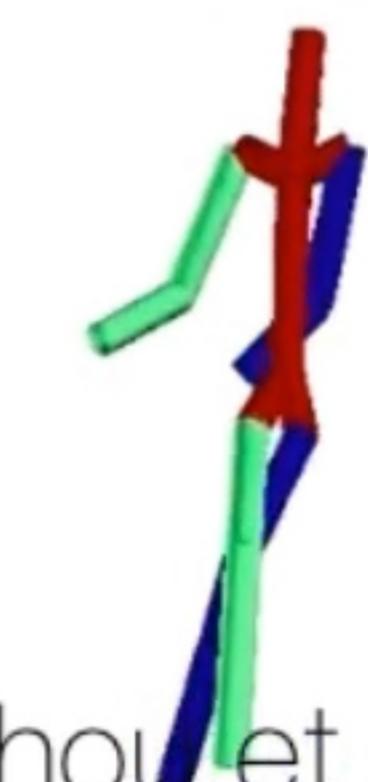
Human3.6M



Ahkter et al
CVPR '15



Ramakrishna et al
ECCV '12



Zhou et al
CVPR '15



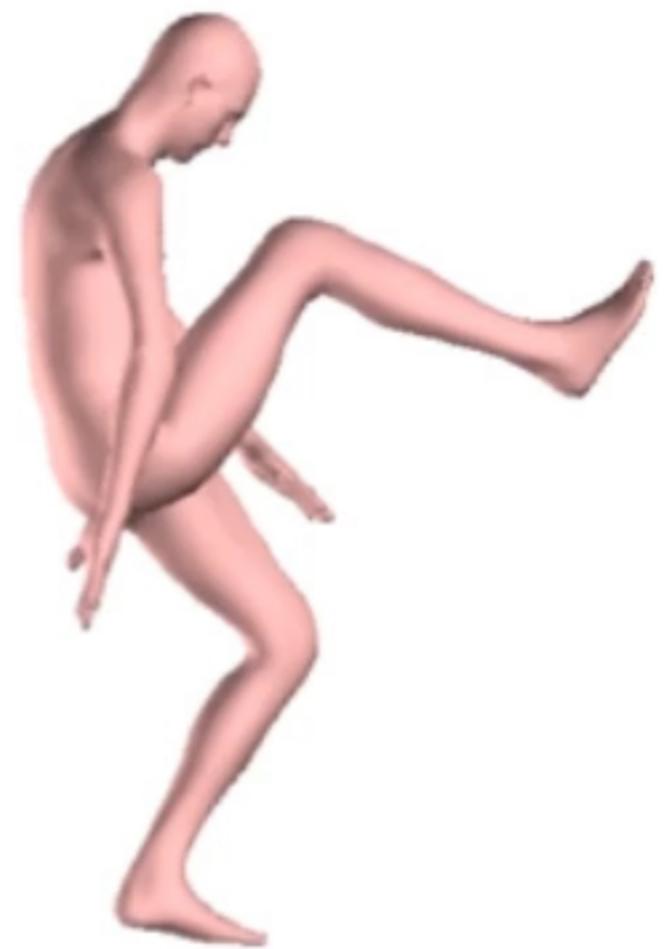
SMPLify

Future work

- Silhouettes
- Multiple camera views
- Video
- Occlusion reasoning in image understanding
- Generate training data

Thanks and see you at Poster #8!

Code and results available at
smplify.is.tue.mpg.de



Acknowledgements: We thank M. Al Borno for inspiring the capsule representation, N. Mahmood for help with the figures, I. Akhter for helpful discussions.