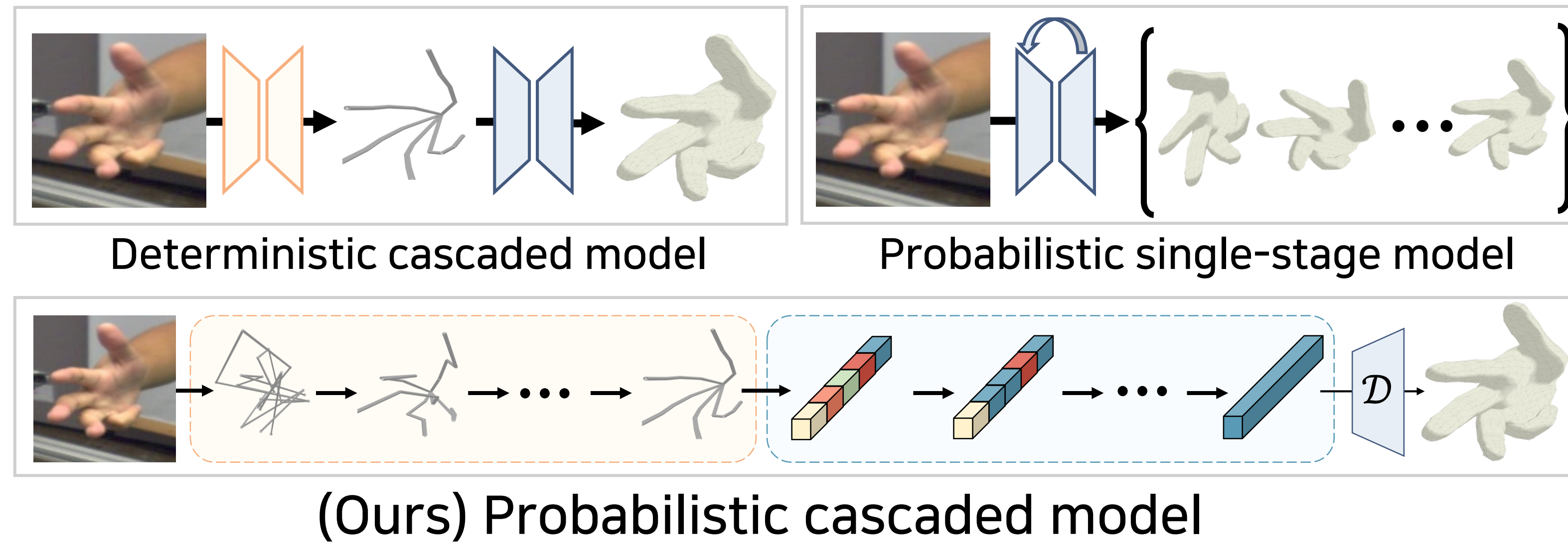


Cascaded Diffusion Framework for Probabilistic Coarse-to-Fine Hand Pose Estimation

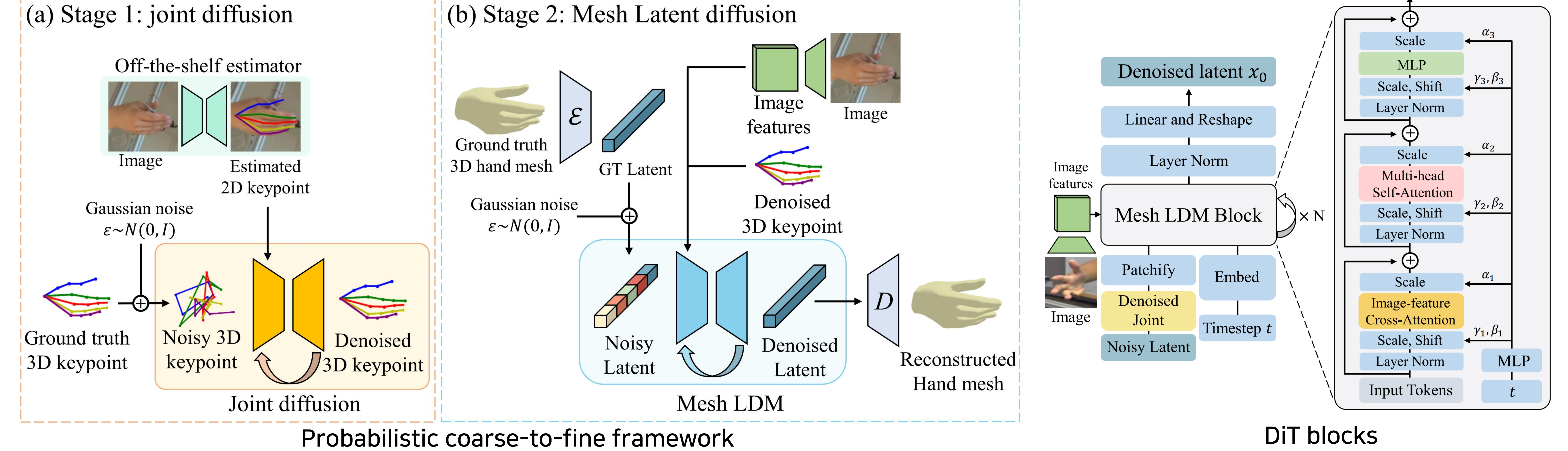
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KAIST

Motivation



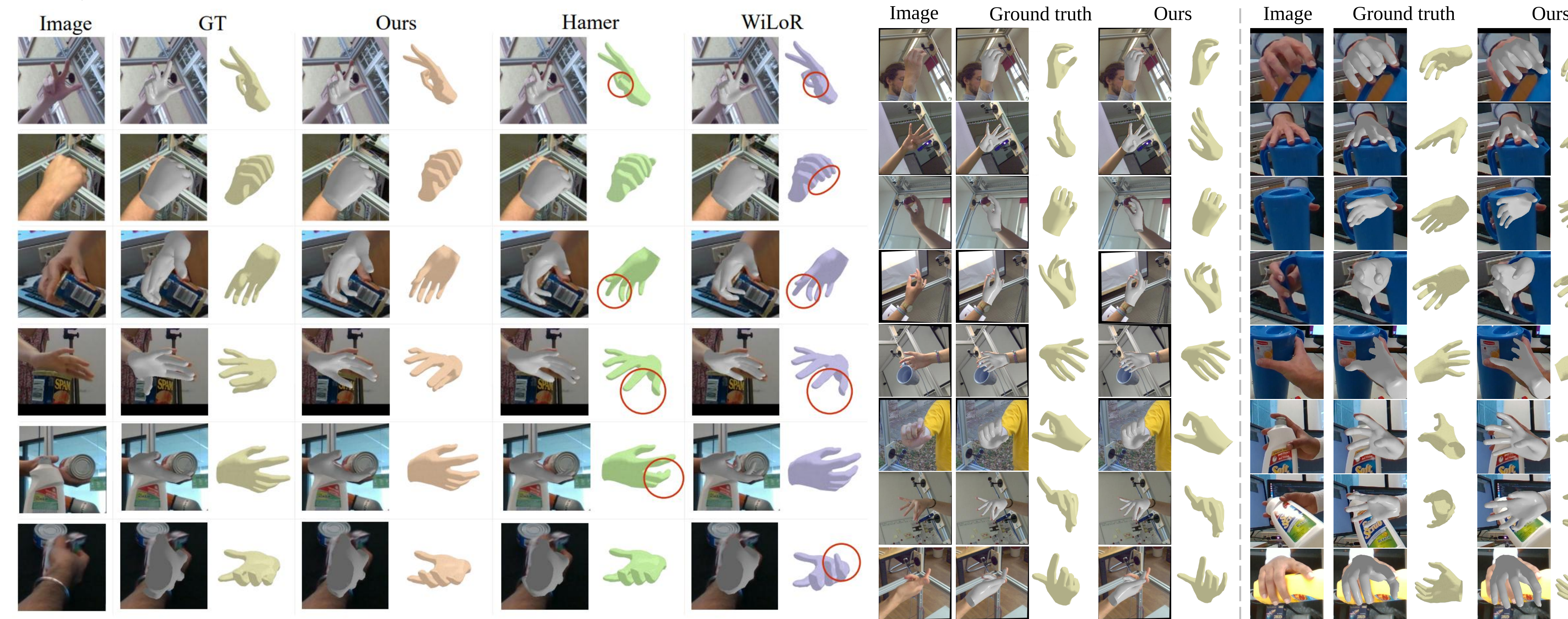
Method	Deterministic cascaded	Probabilistic single-stage	(Ours) Cascaded diffusion
Pipeline	Coarse-to-fine	Single-step	Coarse-to-fine
Diverse hypothesis	✗	✓	✓
Refinement	Step-by-step	Lacks fine details	Step-by-step (+Latent)
Joint condition	Single (fixed)	None (image only)	Diverse
Under occlusion	Error propagates	No joint guidance	Remains stable

Method



- Stage 1 (Joint Diffusion) samples diverse, plausible 3D joint hypotheses from noise, conditioned on off-the-shelf 2D keypoints.
- Stage 2 (Mesh LDM) denoises in the learned latent space using a DiT-based framework, conditioned on sampled joints and image features.
- Our key idea, distribution-aware learning, exposes the mesh stage to diverse joint hypotheses as a training condition, so reconstruction remains stable under coarse joint errors and occlusion.

Qualitative results



Quantitative results

Method	P-MPJPE ↓	P-MPVPE ↓	F@5 ↑	F@15 ↑
I2L-MeshNet [46]	7.4	7.6	0.681	0.973
Pose2Mesh [12]	7.7	7.8	0.674	0.969
I2UV-HandNet [6]	6.7	6.9	0.707	0.977
METRO [40]	6.5	6.3	0.731	0.984
Tang <i>et al.</i> [63]	6.7	6.7	0.724	0.981
Lin <i>et al.</i> [41]	5.9	6.0	0.764	0.986
MobRecon [7]	5.7	5.8	0.784	0.986
AMVUR [29]	6.2	6.1	0.767	0.987
HaMeR [48]	6.0	5.7	0.785	0.990
Hamba [†] [13]	5.8	5.5	0.798	0.991
WiLoR [†] [51]	5.5	5.1	0.825	0.993
HandOS [†] [8]	5.0	5.3	0.812	0.991
HHMR [37]	5.8	5.8	-	-
HHMR (best) [37]	5.3	5.4	-	-
Proposed	5.0	5.2	0.816	0.992
Proposed (best)	4.2	4.5	0.866	0.995

Method	P-MPJPE ↓	P-MPVPE ↓	F@5 ↑	F@15 ↑
Hasson <i>et al.</i> [23]	11.0	11.2	0.464	0.939
Hampali <i>et al.</i> [20]	10.7	10.6	0.506	0.942
I2L-MeshNet [47]	11.2	13.0	0.409	0.932
Pose2Mesh [12]	12.5	12.7	0.441	0.909
Liu <i>et al.</i> [43]	9.9	9.5	0.528	0.956
I2UV-HandNet [6]	9.9	10.1	0.500	0.943
METRO [41]	10.4	11.1	0.484	0.946
ArtiBoost [70]	11.4	10.9	0.488	0.944
MobRecon [7]	9.2	9.4	0.538	0.957
Keypoint Trans. [21]	10.8	-	-	-
HandOccNet [48]	9.1	8.8	0.564	0.963
AMVUR [30]	8.3	8.2	0.608	0.965
HaMeR [49]	7.7	7.9	0.635	0.980
Hamba [†] [13]	7.5	7.7	0.648	0.982
WiLoR [†] [52]	7.5	7.7	0.646	0.983
Proposed	7.5	7.5	0.633	0.982
Proposed (best)	7.4	7.4	0.639	0.982

Method	P-MPJPE ↓	P-MPVPE ↓	AUC _J ↑
Spurr <i>et al.</i> [64]	6.8	-	0.864
MobRecon [7]	6.4	5.6	-
HandOccNet [48]	5.8	5.5	-
H2ONet [68]	5.7	5.5	-
Zhou <i>et al.</i> [74]	5.5	5.5	-
WiLoR [52]	4.9	4.8	0.902
HandOS [8]	5.2	5.0	0.896
Proposed	4.5	4.5	0.911
Proposed (best)	4.2	4.2	0.917

FreiHAND

HO3Dv2

- Competitive across FreiHAND, HO3Dv2; strongest on DexYCB (4.5 P-MPJPE / 0.911 AUC)
- "Proposed (best)" rows are oracle upper bounds (GT-selected among N samples), shown for analysis..
- Averaged prediction matches or approaches SOTA without ground-truth selection.

Ablation studies

Joint condition	P-MPJPE ↓	P-MPVPE ↓	F@5 ↑	F@15 ↑
off-the-shelf [52]	5.1	5.4	0.800	0.991
Averaged joint	5.1	5.4	0.805	0.992
Proposed	5.0	5.2	0.816	0.992
Proposed (best)	4.2	4.5	0.866	0.995

Diffusion space	FreiHAND	HO3Dv2
	P-MPJPE ↓ P-MPVPE ↓	P-MPJPE ↓ P-MPVPE ↓
MANO	5.70 5.82	7.81 7.81
Ours (latent)	5.00 5.23	7.50 7.52

- Joint condition: Diverse joints improve over single condition → diversity as training signal works
- Diffusion space: Latent-space diffusion outperforms direct MANO-space → latent is more effective

Conclusions

- Coarse-to-fine cascaded diffusion: joint diffusion (Stage 1) + Mesh LDM (Stage 2)
- Joint diffusion (Stage 1) generates diverse 3D joint hypotheses; Mesh LDM (Stage 2) reconstructs mesh conditioned on a joint
- Diverse hypotheses used as a training signal (not final outputs) → distribution-aware joint-mesh learning.
- Competitive on FreiHAND & HO3Dv2, best on DexYCB; remains stable under occlusion & pose ambiguity.

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