Tomáš Hodaň, CTU in Prague Martin Sundermeyer, DLR Eric Brachmann, Heidelberg Uni Bertram Drost, MVTec Software Frank Michel, TU Dresden Jiří Matas, CTU in Prague Carsten Rother, Heidelberg Uni

6th International Workshop on Recovering 6D Object Pose ECCV 2020, August 23, online

#### bop.felk.cvut.cz

# **BOP: Benchmark for 6D object pose estimation**

*Hodan, Michel et al. (ECCV 2018)* – To capture and report SOTA in estimating the 6D pose of rigid objects from RGB/RGB-D images.

BOP currently comprises of:

- Evaluation methodology
- Online evaluation system at <u>bop.felk.cvut.cz</u>
- 11 datasets in a unified format
  - Texture-mapped 3D models of 171 objects
  - >700K training RGB-D images (mostly synthetic)
  - >100K test RGB-D images of scenes with graded complexity
  - Images are annotated with ground-truth 6D object poses



# **6D object localization**







#### **BOP 2018**



#### BOP 2019 & 2020



#### BOP 2019 & 2020

Why not 6D object detection, where the number of instances is unknown?

- 1. Evaluating 6D object detection is expensive as many more estimates need to be evaluated to calculate the precision/recall curve.
- 2. The scores on the simpler 6D localization task are far from being saturated.

### **Pose error functions**



Estimated pose



GT pose

How good is the estimated pose?

The error of an estimated pose w.r.t. the GT pose is measured by:

- VSD: Visible Surface Discrepancy
   Error calculated over the visible part ⇒ indistinguishable poses are equivalent.
- 2. **MSSD: Maximum Symmetry-Aware Surface Distance** Measures the surface deviation in 3D ⇒ relevant for robotic applications.
- 3. **MSPD: Maximum Symmetry-Aware Projection Distance** Measures the perceivable deviation  $\Rightarrow$  relevant for AR applications.

See <u>bop.felk.cvut.cz</u> for details.

#### Accuracy score

An estimated pose *E* is considered **correct** w.r.t. ground-truth pose *G* and pose-error function *F*, **if**  $F(E, G) < \theta$ , where *F* is VSD, MSSD or MSPD, and  $\theta$  is the threshold of correctness.

**Average Recall w.r.t. function** *F*:  $AR_F$  = the average of recall rates calculated for multiple settings of threshold  $\theta$  (and tolerance  $\tau$  for VSD). Recall rate = the fraction of objects for which a correct pose is estimated.

Average Recall on dataset D:  $AR_D = (AR_{VSD} + AR_{MSSD} + AR_{MSPD}) / 3$ 

The overall accuracy (AR) = the average of per-dataset  $AR_p$  scores.  $\Rightarrow$  Each dataset is treated as a separate sub-challenge which avoids the overall score being dominated by larger datasets.

See <u>bop.felk.cvut.cz</u> for details.

### Rules

#### 1. For training, a method *can*...

- a. use the provided 3D object models and training images.
- b. render extra training images.
- c. use the range (not a probability distribution) of all GT poses in the test images (e.g. objects are from 20 to 100 cm from the camera).

#### 2. For training, a method *cannot*...

- a. use a single pixel of test images.
- b. use the individual ground-truth poses from test images.
- 3. A fixed set of hyper-parameters required for all objects/datasets.

# **BOP Toolkit**

#### Scripts for reading the standard dataset format, evaluation etc.

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#### Hodan, Michel et al. (ECCV 2018).

#### Classical pre-CNN (RGB-D and D) methods on the SiSo task.

#### Pose error measured with only Visible Surface Discrepancy (VSD).

# Method	LM	LM-O	IC-MI	IC-BIN	T-LESS	RU-APC	TUD-L	Average	Time (s)
• 1. Vidal-18	87.83	59.31	95.33	96.50	66.51	36.52	80.17	74.60	4.7
• 2. Drost-10-edge	79.13	54.95	94.00	92.00	67.50	27.17	87.33	71.73	21.5
• 3. Drost-10	82.00	55.36	94.33	87.00	56.81	22.25	78.67	68.06	2.3
• 4. Hodan-15	87.10	51.42	95.33	90.50	63.18	37.61	45.50	67.23	13.5
• 5. Brachmann-16	75.33	52.04	73.33	56.50	17.84	24.35	88.67	55.44	4.4
• 6. Hodan-15-nopso	69.83	34.39	84.67	76.00	62.70	32.39	27.83	55.40	12.3
• 7. Buch-17-ppfh	56.60	36.96	95.00	75.00	25.10	20.80	68.67	54.02	14.2
• 8. Kehl-16	58.20	33.91	65.00	44.00	24.60	25.58	7.50	36.97	1.8
• 9. Buch-17-si	33.33	20.35	67.33	59.00	13.34	23.12	41.17	36.81	15.9
• 10. Brachmann-14	67.60	41.52	78.67	24.00	0.25	30.22	0.00	34.61	1.4
• 11. Buch-17-ecsad	13.27	9.62	40.67	59.00	7.16	6.59	24.00	22.90	5.9
• 12. Buch-17-shot	5.97	1.45	43.00	38.50	3.83	0.07	16.67	15.64	6.7
• 13. Tejani-14	12.10	4.50	36.33	10.00	0.13	1.52	0.00	9.23	1.4
• 14. Buch-16-ppfh	8.13	2.28	20.00	2.50	7.81	8.99	0.67	7.20	47.1
• 15. Buch-16- $ecsad$	3.70	0.97	3.67	4.00	1.24	2.90	0.17	2.38	39.1

Methods based on Point Pair Features, Template matching methods, Learning-based methods, Methods based on 3D local features

Hodan, Michel et al. (ECCV 2018).

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• 3. 1	Drost-10	82.00	55.36	94.33	87.00	56.81	22.25	78.67	68.06	2.3
• 4.	Hodan-15	87.10	51.42	95.33	90.50	63.18	37.61	45.50	67.23	13.5
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Methods based on Point Pair Features, Template matching methods, Learning-based methods, Methods based on 3D local features

#### Classical and CNN (RGB, RGB-D and D) methods on the ViVo task.

#	Method	Image	Average	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	НВ	YCB-V	Time (s)
1	Vidal-Sensors18 [1]	D	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
2	Drost-CVPR10-Edges [2]	RGB-D	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
3	Drost-CVPR10-3D-Edges [2]	D	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
4	Drost-CVPR10-3D-Only [2]	D	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
5	Drost-CVPR10-3D-Only-Faster [2]	D	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
6	Félix&Neves-ICRA17-IET19 [3,4]	RGB-D	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
7	Sundermeyer-IJCV19+ICP [5]	RGB-D	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
8	Zhigang-CDPN-ICCV19 [6]	RGB	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
9	Sundermeyer-IJCV19 [5]	RGB	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
10	Pix2Pose-BOP-ICCV19 [7]	RGB	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
11	DPOD (synthetic) [8]	RGB	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

[1] Joel Vidal et al., A Method for 6D Pose Estimation of Free-Form Rigid Objects Using Point Pair Features on Range Data, Sensors 2018.

[2] Bertram Drost et al., Model globally, match locally: Efficient and robust 3D object recognition, CVPR 2010.

[3] Pedro Rodrigues et al., Deep segmentation leverages geometric pose estimation in computer-aided total knee arthroplasty, Healthcare Technology Letters 2019.

[4] Carolina Raposo et al., Using 2 point+normal sets for fast registration of point clouds with small overlap, ICRA 2017.

[5] Martin Sundermeyer et al., Augmented Autoencoders: Implicit 3D Orientation Learning for 6D Object Detection, IJCV 2019.

[6] Zhigang Li et al., CDPN: Coordinates-Based Disentangled Pose Network for Real-Time RGB-Based 6-DoF Object Pose Estimation, ICCV 2019.

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Classical methods outperformed CNN methods, because of:

 Insufficient number of real training images annotated with 6D object poses – annotation is expensive!



2. **Large domain gap** between real test images and the commonly used synthetic training images (objects rendered on random background).



#### **BOP Challenge 2020** – What is new?

- BlenderProc4BOP an open-source photorealistic (PBR) renderer.
- **350K pre-rendered training images** provided to the participants.



#### **BOP Challenge 2020** – Submissions

Submission system: <u>bop.felk.cvut.cz</u>, deadline: August 19, 2020.

#### 862 submissions, 665 since BOP 2019.

One submission = results of one method on one dataset.

# **26 methods, 15 since BOP 2019, evaluated on all 7 core datasets:** LM-O, T-LESS, TUD-L, IC-BIN, ITODD, HB, YCB-V.

BOP: Benchmark for 6D Object Pose Estimation												
Signed in as thodan: My methods My submissions Edit account Sign out												
HOME CHALLENGES DATASETS LEADERBOARDS SUBMIT RESULTS												
BOP Challenge 2019/2020: Core datasets LM LM-O T-LESS ITODD HB YCB-V RU-APC IC-BIN IC-MI TUD-L TYO-L												

#### BOP Challenge 2019/2020 - core datasets

This leaderbord shows the overall ranking on the <u>core datasets</u> (LM-O, T-LESS, TUD-L, IC-BIN, ITODD, HB, YCB-V). For each method, the date of the latest considered submission is reported. If more submissions of a method are available for a dataset, the submission with the highest AR score is considered. The performance scores are defined in the <u>challenge</u> <u>description</u>. The reported time is the average image processing time averaged over the core datasets.

Show	how 50  entries Search:												
	Date (UTC) 🔶	Method	Test image 🕴	AR <sub>Core</sub> \$	AR <sub>LM-0</sub>	AR <sub>T-LESS</sub>	AR <sub>TUD-L</sub> ♦	AR <sub>IC-BIN</sub>	AR <sub>ITODD</sub>	AR <sub>HB</sub>	AR <sub>YCB-V</sub>	Time (s) 🔶	
1	2020-08-19	CosyPose-ECCV20-SYNT+REAL-1VIEW-ICP	RGB-D	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743	
2	2020-08-19	Koenig-Hybrid-DL-PointPairs	RGB-D	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633	
3	2020-08-18	CosyPose-ECCV20-SYNT+REAL-1VIEW	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449	
4	2020-08-17	Pix2Pose-BOP20_w/ICP-ICCV19	RGB-D	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	<mark>4.84</mark> 4	
5	2020-08-18	CosyPose-ECCV20-PBR-1VIEW	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475	
6	2019-10-22	Vidal-Sensors18	D	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220	

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	НВ	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

Five new methods outperform Vidal-Sensors18, the winner of BOP 2018 & 2019.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

#### CNN-based methods finally caught up with PPF-based methods!

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	. <b>-</b> 1	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	Ξ	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

#### CNN models can be effectively shared among multiple objects.

Training special CNN model(s) per object used to be a common practise.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

**Almost all participating deep learning methods train on RGB images only.** Deep RGB-D approaches (e.g. DenseFusion) are welcome to join the challenge!

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	Ξ	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No		-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

#### Most methods used both synthetic and real training images, but...

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	PB	R	Ye0	ther	synt	hetic	RUB (	eal in	nage	<b>95</b> .633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0 820	0 390	0.351	0 695	0 780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGE	<u>BR in</u>	nage	<b>95</b> .633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	Ξ	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No		-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

# **Competitive results can be achieved with PBR training images only.**

(For LM-O, IC-BIN, ITODD and HB, only synthetic training images are provided.)

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	.=	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0 532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	{yn ₽∋a`	RUB	eal in	nage	<b>95</b> .624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	Ξ	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0 490	0 769	0.327	0.067	0.672	0 457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGE	BR in	nage	<b>2S</b> .624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No		-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

#### **Competitive results can be achieved with PBR training images only.** (For LM-O, IC-BIN, ITODD and HB, only synthetic training images are provided.)

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0 527	0 444	0 775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+r eal	BR I	mag	<b>95</b> .479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0 237	0 487	0 614	0 281	0 158	0.506	0.505	0.865
20	Zhigang-CDPN-IMages of O	0	961	Ss(	<b>Najika</b>	ndor	<u>Bynbal</u>	ckgi	ounc	<b>S</b> .353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

**PBR training images yield a noticeable improvement over "naively" synthesized images (objects rendered on random backgrounds).** Similarly to CDPN, EPOS jumped from 0.44 to 0.55 on LM-O with the PBR images.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	Ξ	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The RGB methods are back! The clear dominance of D-based methods is over.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BOP20 (RGB-only & ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CVPR10-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2_BOP20 (PBR-only & ICP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BOP20 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	Yes	No	-	-	-	D	ICP	0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

# **Post-refinement of pose estimates boosts accuracy**, but reduces speed (sometimes significantly).

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-Err 20-Syn Peal-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose 20_w/ICP-IC 9	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyFV_EC D <sup>30</sup> C D <sup>Vie</sup>	2020	10	Yes	C'dataset	RGB	PBConly	RGP		0.570	0 633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal Sors DUP	201 <mark>.</mark>	1. e_	5		l al	DE	DL		6.60	6.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPWP BODY OF BODY OF & D	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost- R1- Le	209	ÖS	vΡ	ose-	ECCV	/20-S	vnt	+Rea	1-1V	'iew	-ICP	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2 2 F20 (PBR-only 200P)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_BCC	2030	No	Yes	1/cbifct	RGBuct	Synt+real	RGB	Notior-	1 222	h:624	_A:478	0.772	0.473		0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	unne	, jusi	in cu	per	iller,	NUGU	тęų	ĄųĻ	נ <sub>כו.</sub> ע יי	Uşej	21462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	20(9	0S	vPo	bse: (	Cons	isten	it mi	ulti-v	iew	mul	ti-oł	biect	5 6 D	pos	e <sup>0.615</sup>	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object	PEPCC	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	205	ŞLΠ	\_[C	μ <u>υ</u> βείτι,	REPC	V <sub>BI</sub> ∠Q.	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing method on the seven core datasets.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECC 20-Syn Ceal-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose 720_w/ICP-IC 9	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyFy EC 30 - PE-Vie	2020	10	Yes	2 (dataset	RGB	PBR only	RC	RGB	0.570	7.633	1.640	0,585	0.583	0.216	0.656	0.574	0.475
6	Vidal sors DUP	201 <mark>_</mark>	ì.e.		DE2		pen	<b>5</b> 30		2.565	VIE	L J.LS	6376	0.393	0.435	0.706	0.450	3.220
7	CDPN BOTTOTO & L	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CR1-Le	20 9	ÖS	vP	ose-	ECCV	/20-S	vnt	+Rea	I-1V	'iew	-ICP	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2 C20 (PBR-only mP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_B	2020	No	Yes	1/bifct	RGB	Synt+real	RGB	Notior-	NA 529	h:624	_ <b>Å</b> .47	0.772	0.473		0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No	unne	, jusi	<u>I</u> II Cu	per	iller,	NUGU	теų	'nμ	ן איז איז	Uşej		<b>C</b> , 0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	20(9	0S	γP	ose: (	Cons	isten	it mi	ulti-v	iew	mul	ti-oł	bject	: 6D	pos	e <sup>0.615</sup>	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object		Synt+roal	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	20	Şμ	ήfο	μ <u>υ</u> βει,	REPC	$V_{B} \leftarrow Q_{y}$ .	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing method on the seven core datasets with publicly available source code.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECC 20-Syn Ceal-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose 720_w/ICP-IC 9	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyFy EC 30 PB Vie	2020	10	Yes	2 (dataset	RGP	PBR on 7	RGB	RGB	0-570	1.633	1.640	0,585	0.583	0.216	0.656	0.574	0.475
6	Vidal sors DUP	201 <mark>_</mark>	l.e.		DE2	L	IIgr	<u>3-17</u>	<b>FO</b>	0.56	VIE	L J.LSL	00376	0.393	0.435	0.706	0.450	3.220
7	CDPW BODY OF BODY O & L	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost- R1-La	20 9	ŌS	vΡ	ose-	ECCV	/20-S	vnt	+Rea	I-1V	'iew	-ICP	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPNv2 2 P20 (PBR-only AnP)	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2_B	2020	No		1/pift	RGB	Synt+real	RGB	Notior-	NA 329	hi <u>624</u>		0.772	0.473		0.722	0.532	0.935
11	Drost-CVPR10-3D-Edges	2019	Yes	No-	unne	, jusi	in Cu	per	iger,	IVI GUL	ЩĘų	$\neg u \mu$	נ-יעיי	USEJ		0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	20(9	0S	yΡ	ose: (	Cons	isten	t mi	ulti-v	iew	mul	ti-oł	bject	: 6D	pos	e <sup>0.615</sup>	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	No	Yes	1/object		Synt+roal	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2029	ŞLΠ	$\downarrow_{\rm L}$	μυ <sub>e</sub> t,	REPC	$V_{B} \leftarrow Q_{y}$	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing method on the seven core datasets which uses a single machine learning model (e.g. a neural network) per dataset, i.e. not one per object.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BO77_w/ICF 1CV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPost CV20-PBR-1	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-	2010	Tes	No	Roc	+ -	ct-		<sup>tc</sup> ho	.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPIN BOP BALSIN & I	202 <mark>J</mark>	1.0	.∵es		GE	5, it eal	VCB -		<b>J</b> .568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8		2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPN 10 COC 8 7	20: <b>K</b>	oe	ni	g-Hv	brid-	-DL=P	oin	tPaiı	<b>S</b> <sup>0.534</sup>	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNv2 20 (RGB-onl)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.529	0.624	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-CVP	<sup>20</sup>	ðħ.		aKo	onia-	Rortr	am-	<b>D</b> roct	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVPR10-3D-Only	2019	ζų			ring,	Derti	ym.		0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	20A	N <del></del> N	ybr	id Ap	opro	ach f	or6	Dof	Pose	e Est	ima	tion	, EC	CVW	/'20.	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	2020	No	Yes	1/object	RGB	PBR only	RGB	No	0.472	0.624	0.407	0.588	0.473	0.102	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	2020	No	Yes	1/dataset	RGB	PBR only	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing method on the seven core datasets with the average running time per image below 1s.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECC 20-PBN View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Ser 18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPN OP OP OF THY &	2020		Yes	obiect	RGE	Cyristeal	GB-D		0.563	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8		201 <mark>J</mark>	`.e.	<b></b>				-SL-L		55		0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDP BOD CBD & I	2020	No	Yes	1/object	RGB	PBR only	RGB-D	ICP	0.534	0.630	0.435	0.791	0.450	0.186	0.712	0.532	1.491
10	CDPNtz 102000	200	OS	vP	ose-	ECCV	/20-S	vnt	+Rea	I-1V	ïew	0.478	0.772	0.473	0.102	0.722	0.532	0.935
11	Drost-Com 1-3D-Edges	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drost-CVP	2019	Yes	No	ahhó	luct	in Ca	Pnor	fior_	$\Lambda \Lambda A^{487}_{\alpha t}$	hi527	-A:44	$r_{1}^{0.775}$	0.388	$Ci^{316}$	0.615	0.344	7.704
13	CDPN_BOP19 (RGB-only)	2020	$\mathcal{A}_{N_0}^{III}$	Yes	4/object	ຸງູບິວເ	Synt+rear	I PBEI		IVIQU	10.569	$\neg u_{y}$	נאיעיי	USEJ	-9.64	0.672	0.457	0.480
14	CDPNv2_BOP20 (PBR-only&RGB-only)	200	OS'	γPo	ose: (	Eons	isten	it mi	ulti-v	iew_	mul	ti-ot	bject	:6D	pos	e <sup>0.722</sup>	0.390	0.978
15	leaping from 2D to 6D	2020	No.	Yes	1/object		い いって	RGB	No	0.471	0.525	0.403	0.751	0.342	0.077	0.658	0.543	0.425
16	EPOS-BOP20-PBR	205	ຊຸບເ	1 lo	Hugasel,		$\Psi_{B} \leftarrow Q_{y}$	RGB	No	0.457	0.547	0.467	0.558	0.363	0.186	0.580	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	-	-	-	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	Yes	Yes	1/dataset	RGB-D	Synt+real	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing RGB-only method on the seven core datasets.

#	Method	Year	PPF	CNN	models	Train. im.	type	Test im.	Refine.	Avg.	LM-O	T-LESS	TUD-L	IC-BIN	ITODD	HB	YCB-V	Time
1	CosyPose-ECCV20-Synt+Real-1View-ICP	2020	No	Yes	3/dataset	RGB	Synt+real	RGB-D	RGB+ICP	0.698	0.714	0.701	0.939	0.647	0.313	0.712	0.861	13.743
2	Koenig-Hybrid-DL-PointPairs	2020	Yes	Yes	1/dataset	RGB	Synt+real	RGB-D	ICP	0.639	0.631	0.655	0.920	0.430	0.483	0.651	0.701	0.633
3	CosyPose-ECCV20-Synt+Real-1View	2020	No	Yes	3/dataset	RGB	Synt+real	RGB	RGB	0.637	0.633	0.728	0.823	0.583	0.216	0.656	0.821	0.449
4	Pix2Pose-BOP20_w/ICP-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.591	0.588	0.512	0.820	0.390	0.351	0.695	0.780	4.844
5	CosyPose-ECCV20-PBR-1View	2020	No	Yes	3/dataset	RGB	PBR only	RGB	RGB	0.570	0.633	0.640	0.685	0.583	0.216	0.656	0.574	0.475
6	Vidal-Sensors18	2019	Yes	No	-	-	-	D	ICP	0.569	0.582	0.538	0.876	0.393	0.435	0.706	0.450	3.220
7	CDPNv2_BO77 (RGB& ICP)	2020	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.568	0.630	0.464	0.913	0.450	0.186	0.712	0.619	1.462
8	Drost-CV J-Edges	2019	Yes	No	-	-	-	RGB-D	ICP	0.550	0.515	0.500	0.851	0.368	0.570	0.671	0.375	87.568
9	CDPN V OPPO PS	2022		Yes	obiect	RGE	PBR only	RGB-D	Dro	0.501	0.630	0.435		0.450	0.186	.712	0.532	1.491
10	CDPN BOP D. IIII	202 <mark>J</mark>	1.0	. es	100,00	GE	Synt-rua-		.10	0.52J	0.5.4	L.4.5	<b>U</b> J.7 <b>1</b> 2	0.75	d.1.2	<b>U</b> .722	0.532	0.935
11	Drost PR1530590	2019	Yes	No	-	-	-	D	ICP	0.500	0.469	0.404	0.852	0.373	0.462	0.623	0.316	80.055
12	Drosta R12020	20 9	OS	vP	ose-	ECCV	/20-P	BR-	1Vie	<b>V</b> 0.487	0.527	0.444	0.775	0.388	0.316	0.615	0.344	7.704
13	CDPN_Box (RGB-only)	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.479	0.569	0.490	0.769	0.327	0.067	0.672	0.457	0.480
14	CDPNv2_BC PC RGB-only)	2030	no	Yes	$\lambda h h h \delta$	RGBuct	in Co	RGB	ntior_	$\Lambda \Lambda 472$	hiôu	<u> </u>	0.588	$\int_{0}^{0.473} f$	Cil <sup>0</sup>	0.722	0.390	0.978
15	leaping from 2D to 6D	2020	μ <sub>No</sub> Π	Yes	UDD ect	, jusi	Synt+real	per		IVIQU	11 <u>eu</u>	7 <u>.405</u>	נ-, עיי	Uşej	<b>3777</b>	0.658	0.543	0.425
16	EPOS-BOP20-PBR	200	OS'	yΡα	DSe:⊧t	Cons	isten	tem	ulti-v	iew_	mul	ti-ok	bject	: 6D	pos	e <sup>0.580</sup>	0.499	1.874
17	Drost-CVPR10-3D-Only-Faster	2019	Yes	No	tion	ECC	$\sqrt{2}$	D	ICP	0.454	0.492	0.405	0.696	0.377	0.274	0.603	0.330	1.383
18	Félix&Neves-ICRA2017-IET2019	2019	ခုပ္စ၊	↓ <sub>es</sub> o	Hualaset,	RGB-D	Syntrear	RGB-D	ICP	0.412	0.394	0.212	0.851	0.323	0.069	0.529	0.510	55.780
19	Sundermeyer-IJCV19+ICP	2019	No	Yes	1/object	RGB	Synt+real	RGB-D	ICP	0.398	0.237	0.487	0.614	0.281	0.158	0.506	0.505	0.865
20	Zhigang-CDPN-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.353	0.374	0.124	0.757	0.257	0.070	0.470	0.422	0.513
21	PointVoteNet2	2020	No	Yes	1/object	RGB-D	PBR only	RGB-D	ICP	0.351	0.653	0.004	0.673	0.264	0.001	0.556	0.308	-
22	Pix2Pose-BOP20-ICCV19	2020	No	Yes	1/object	RGB	Synt+real	RGB	No	0.342	0.363	0.344	0.420	0.226	0.134	0.446	0.457	1.215
23	Sundermeyer-IJCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.270	0.146	0.304	0.401	0.217	0.101	0.346	0.377	0.186
24	SingleMultiPathEncoder-CVPR20	2020	No	Yes	1/all	RGB	Synt+real	RGB	No	0.241	0.217	0.310	0.334	0.175	0.067	0.293	0.289	0.186
25	Pix2Pose-BOP19-ICCV19	2019	No	Yes	1/object	RGB	Synt+real	RGB	No	0.205	0.077	0.275	0.349	0.215	0.032	0.200	0.290	0.793
26	DPOD (synthetic)	2019	No	Yes	1/scene	RGB	Synt	RGB	No	0.161	0.169	0.081	0.242	0.130	0.000	0.286	0.222	0.231

The top-performing method on the seven core datasets which was trained only with the provided BlenderProc4BOP images.

#### **The Best Methods on Individual Datasets** (1/2)

#### LM-O, TUD-L, IC-BIN, YCB-V: CosyPose-ECCV20-Synt+Real-1View-ICP

*Yann Labbé, Justin Carpentier, Mathieu Aubry, Josef Sivic,* CosyPose: Consistent multi-view multi-object 6D pose estimation, ECCV'20.

#### ITODD, TYO-L: Drost-CVPR10-Edges

*Bertram Drost, Markus Ulrich, Nassir Navab, Slobodan Ilic,* Model globally, match locally: Efficient and robust 3D object recognition, CVPR'10.

#### LM: DPODv2 (synthetic train data, RGB + D Kabsch)

*Sergey Zakharov, Ivan Shugurov, Slobodan Ilic,* DPOD: Dense 6D Pose Object Detector in RGB images, ICCV'19.

#### T-LESS: CosyPose-ECCV20-Synt+Real-1View

*Yann Labbé, Justin Carpentier, Mathieu Aubry, Josef Sivic,* CosyPose: Consistent multi-view multi-object 6D pose estimation, ECCV'20.

#### **The Best Methods on Individual Datasets** (2/2)

#### HB: CDPNv2\_BOP20 (RGB-only)

*Zhigang Li, Gu Wang, Xiangyang Ji,* CDPN: Coordinates-Based Disentangled Pose Network for Real-Time RGB-Based 6-DoF Object Pose Estimation, ICCV'19.

#### RU-APC: Pix2Pose-BOP19\_w/ICP-ICCV19

*Kiru Park, Timothy Patten, Markus Vincze,* Pix2Pose: Pixel-Wise Coordinate Regression of Objects for 6D Pose Estimation, ICCV'19.

#### IC-MI: Drost-CVPR10-3D-Only

*Bertram Drost, Markus Ulrich, Nassir Navab, Slobodan Ilic,* Model globally, match locally: Efficient and robust 3D object recognition, CVPR'10.

### Summary

- BlenderProc4BOP an open-source photorealistic (PBR) renderer.
- 350K pre-rendered PBR training images.
- 26 methods evaluated on all core datasets.
- CNN-based methods caught up with PPF-based methods.
- RGB methods yield strong results with the PBR training images.
- The submission form for the BOP Challenge 2020 stays open!