



TurboReg: TurboClique for Robust and Efficient Point Cloud Registration

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<https://github.com/Laka-3DV/TurboReg>



Training-free



SOTA



60+FPS

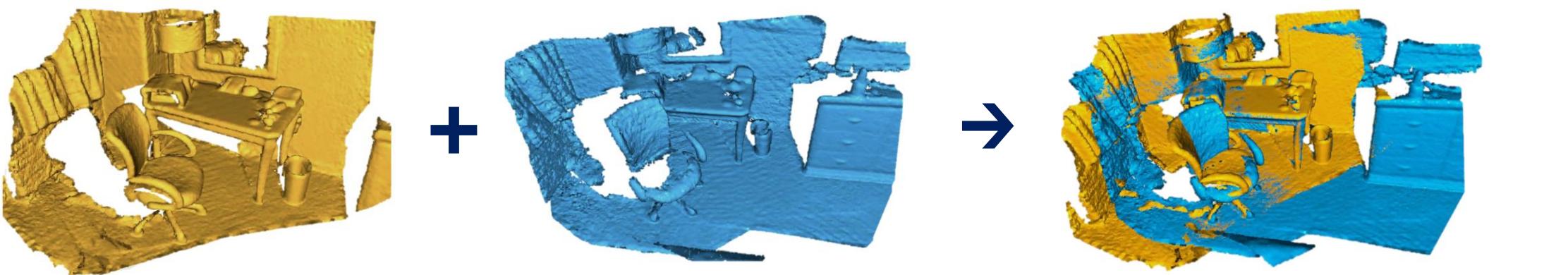


Cross-platform



Motivation & Problem

Point Cloud Registration (PCR)

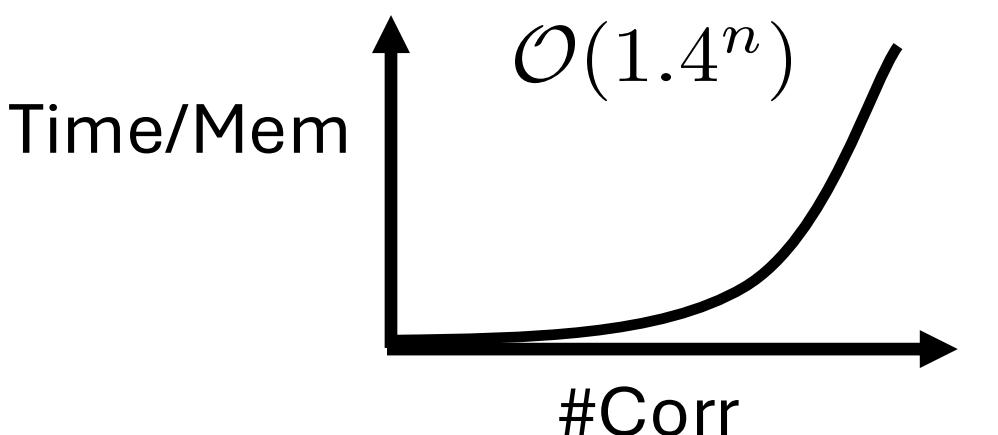


Align two 3D scans captured from different viewpoints.

Challenges

3DMAC (CVPR-23 Student Best Paper)

Core: Enumerate maximal cliques on a compatibility graph.



- ✓ Accuracy – SOTA
- ✗ Efficiency
 - Slow (< 1FPS)
 - Out of memory

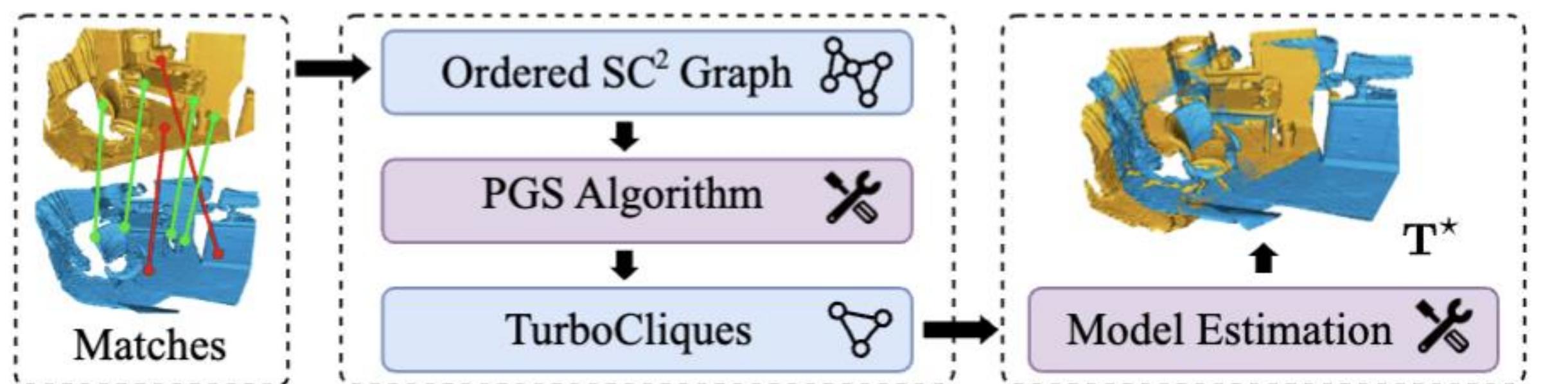
“Can we make Point Cloud Registration both accurate and real-time?”

Core Idea: No more Maximal Cliques.

★ A lightweight, PCR-tailored **TurboClique**.

★ A parallel search scheme — **PGS**.

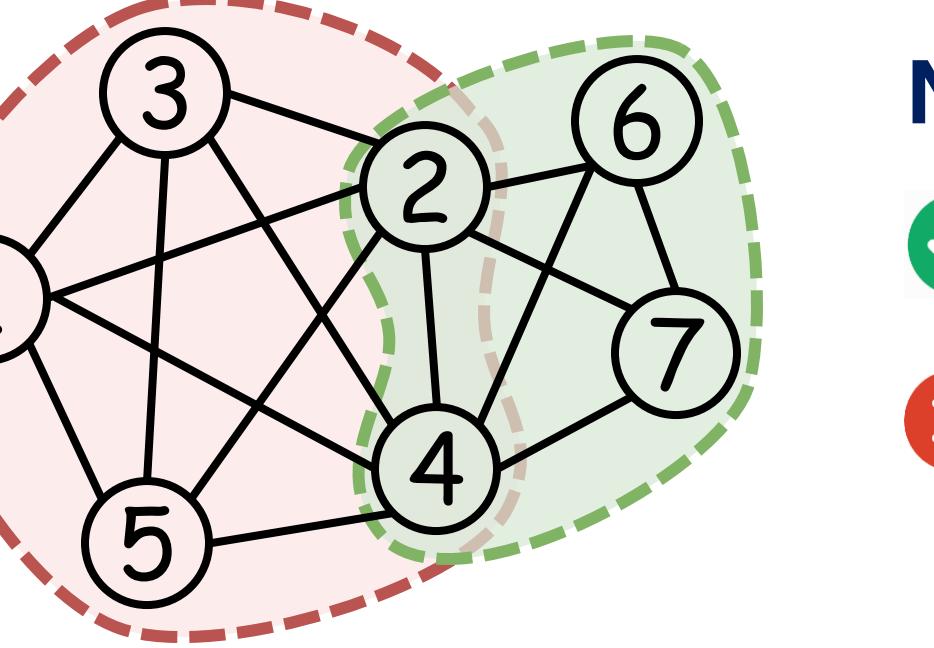
Method Overview



Construct O2Graph → search TurboCliques → estimate transformations → select the one with the highest inlier ratio.

Key Techniques [0] ← TurboClique

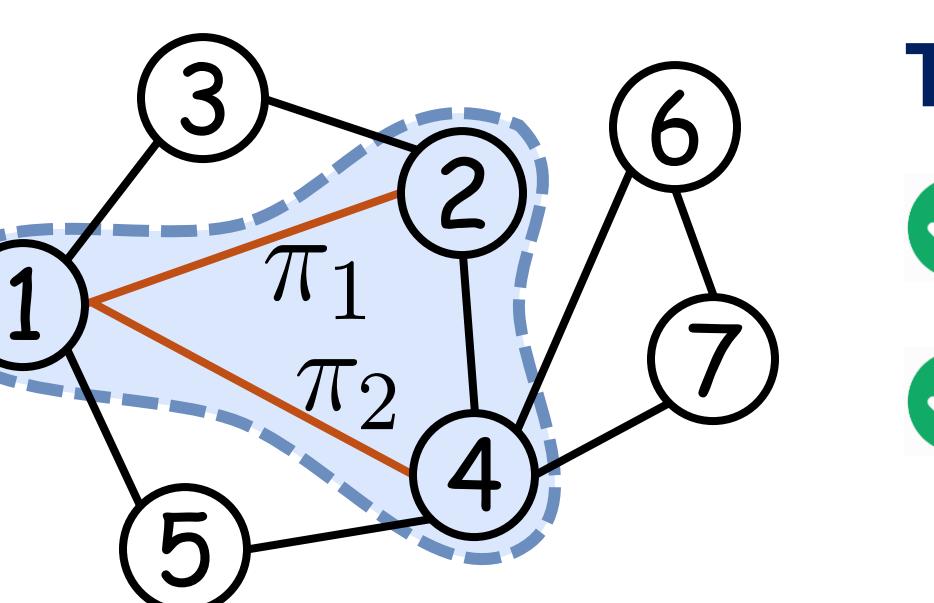
[0] A Lightweight Yet Stable Clique for PCR



Maximal Clique

- ✓ Stable
- ✗ Large → Expensive

⋮



TurboClique

- ✓ 3-clique → Lightweight
- ✓ Strict Compatibility
- Stable

Key Techniques [1] ← PGS

[1] Full Parallelism Search for TurboCliques

- **Core:** Search TurboCliques around pivots defined by high SC2-score edges.

Complexity

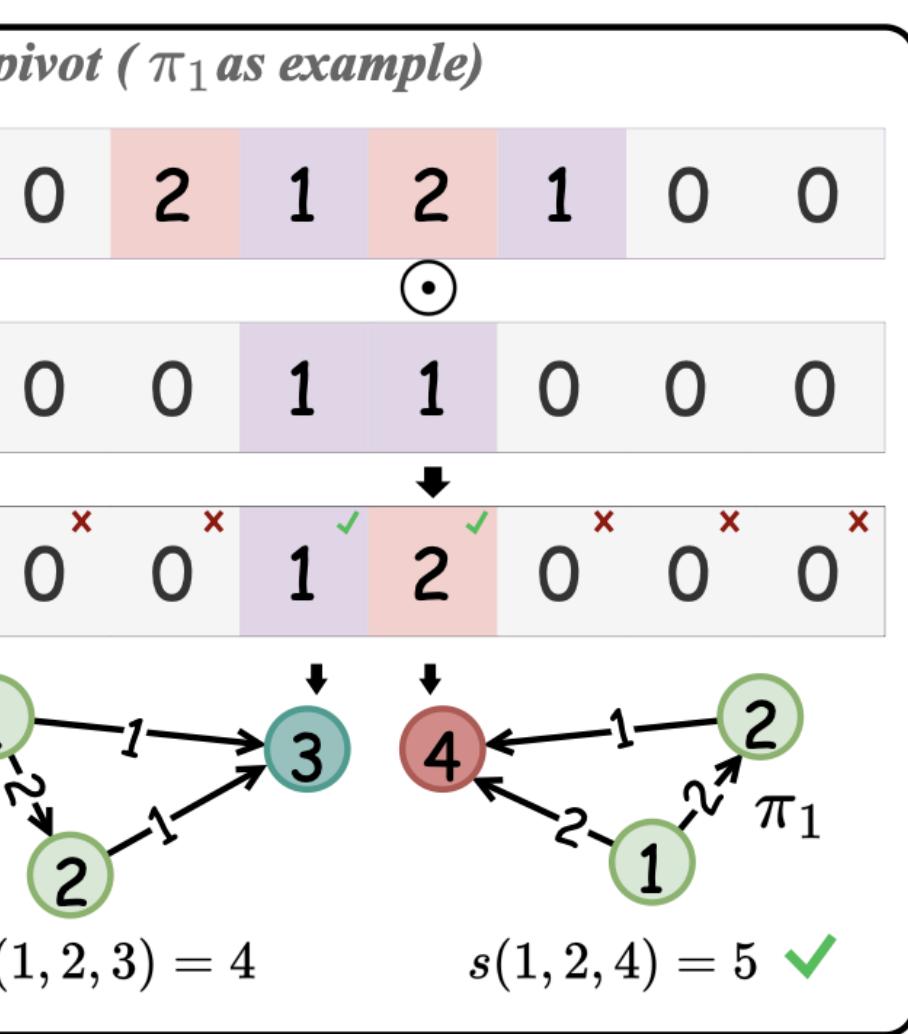
- $O(N)$ on CPU
- **O(1)** on GPU → **60+FPS**
- Speedup $\times 200+$

1	2	3	4	5	6	7
1	0	2	1	2	1	0
2	0	0	1	1	0	0
3	0	0	0	0	0	0
4	0	0	0	0	1	1
5	0	0	0	0	0	0
6	0	0	0	0	0	1
7	0	0	0	0	0	0

(a) Input: O2Graph \tilde{G}

1	2	3	4	5	6	7
1	0	2	1	2	1	0
2	0	0	1	1	0	0
3	0	0	0	0	0	0
4	0	0	0	0	1	1
5	0	0	0	0	0	0
6	0	0	0	0	0	1
7	0	0	0	0	0	0

(b) Pivots



(c) TurboClique Search

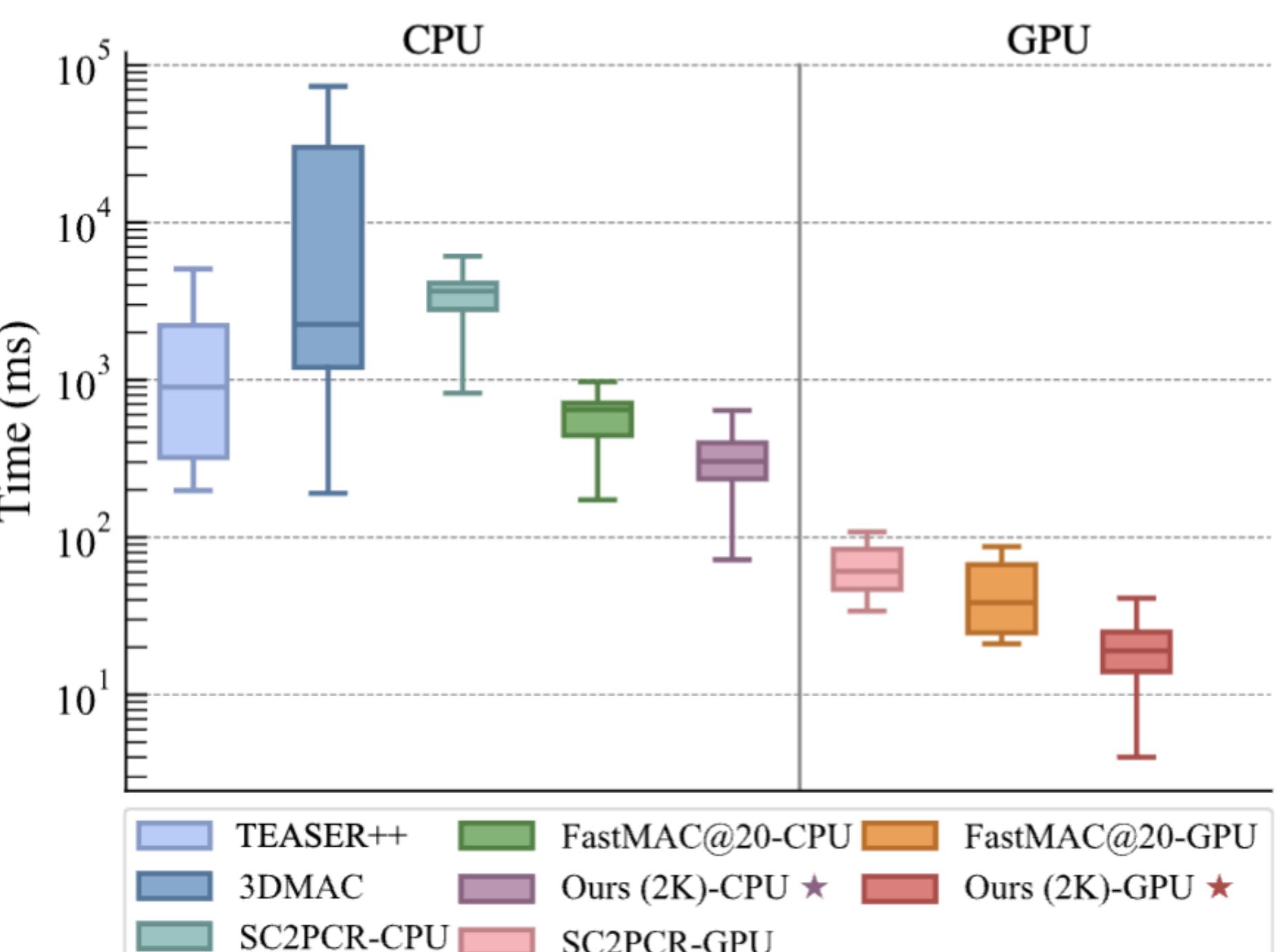
Select top- K_1 pivots by SC2 scores → Search all 3-cliques around each pivot → Retain top- K_2 TurboCliques ($K_1 \times K_2$ total).

Results

Accuracy on 3DMatch Dataset

Methods	FPFH			FCGF			FPS
	RR(%)	RE($^{\circ}$)	TE(cm)	RR(%)	RE($^{\circ}$)	TE(cm)	
i) Deep Learned							
DGR [12]	32.84	2.45	7.53	88.85	2.28	7.02	0.43 0.91
PointDSC [5]	72.95	2.18	6.45	91.87	2.10	6.54	0.20 10.74
VBReg [25]	82.75	2.14	6.77	93.16	2.33	6.68	0.06 7.62
ii) Learning Free							
RANSAC-1M [17]	64.20	4.05	11.35	88.42	3.05	9.42	0.05 -
RANSAC-4M [17]	66.10	3.95	11.03	91.44	2.69	8.38	0.01 -
GC-RANSAC [7]	67.65	2.33	6.87	92.05	2.33	7.11	1.01 -
TEASER++ [51]	75.48	2.48	7.31	85.77	2.73	8.66	1.12 -
CG-SAC [40]	78.00	2.40	6.89	87.52	2.42	7.66	-
SC ² -PCR [10]	83.73	2.18	6.70	93.16	2.09	6.51	0.27 15.84
3DMAC [61]	83.92	2.11	6.80	92.79	2.18	6.89	0.31 -
FastMAC@50 [62]	82.87	2.15	6.73	92.67	2.00	6.47	1.35 4.33
FastMAC@20 [62]	80.71	2.17	6.81	92.30	2.02	6.52	1.56 26.32
Ours (1K)	83.92	2.17	6.79	93.59	2.03	6.40	2.73 61.25
Ours (2K)	84.10	2.19	6.81	93.59	2.04	6.42	2.46 54.04

Runtime Comparison



Summary & Takeaway

➤ **Analyze.** Existing graph-based PCR suffers from exponential complexity and poor parallelism.

➤ **Redesign.** TurboClique & PGS bring lightweight, fully parallel graph reasoning tailored for PCR.

➤ **Achieve.** Real-time (60+ FPS), training-free registration with SOTA accuracy.