

A Performance Comparison of General Purpose Multi-Dimensional In-Memory Indexes – All Results

Revision 1.1 – 18th September 2017

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1. INTRODUCTION

This document contains all TinSpin¹ test results from the test runs between November 2016 and January 2017.

- Revision 1.0 2017-01-28 Initial version.
- Revision 1.1 2017-09-18 Added brief section on data.

2. INDEXES

The following index implementations were tested:

- CBF CritBit tree by J. Fager²
- CBZ CritBit tree by T. Zäschke³
- KDL KD-Tree by Levy⁴
- KDS KD-Tree by Savarese⁵
- PH/PHM PH-Tree by T. Zäschke et al.⁶
- QTZ Quadtree by T. Zäschke³
- RSS R*Tree by N. Beckmann et al⁷, optimized for in-memory use by T. Zäschke
- RSZ R*Tree by T. Zäschke³
- STRZ R*Tree by T. Zäschke³
- XTS X-Tree by S. Berchtold et al⁷, optimized for in-memory use by T. Zäschke

¹<http://www.tinspin.org>

²<https://github.com/jfager/functional-critbit>

³<http://www.tinspin.org>

⁴<http://home.wlu.edu/~levys/software/kd/>

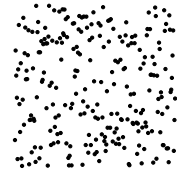
⁵<https://www.savarese.com/software/libssrckdtree-j/>

⁶<http://www.phtree.org>

⁷<http://chorochronos.datastories.org>



(a) 2D CUBE



(b) 2D CLUSTER



(c) OSM Alps

Figure 1: The CUBE, CLUSTER and OSM Alps datasets

3. TEST DATA

The OSM-P (points) and OSM-R (rectangles) datasets are extracts from OpenStreetMap.org representing the European Alps⁸, extracted on 2016-11-09 (Fig. 1c). The dataset consists of $\approx 2.1 \times 10^8$ points. The rectangles (OSM-R) are bounding boxes for all line segments in the dataset.

The synthetic CU-P/CU-R datasets (Fig. 1a), have the shape of a cube filled with up to 50,000,000 elements that are distributed uniformly at random between 0.0 and 1.0 in every dimension. Each element has unique coordinates.

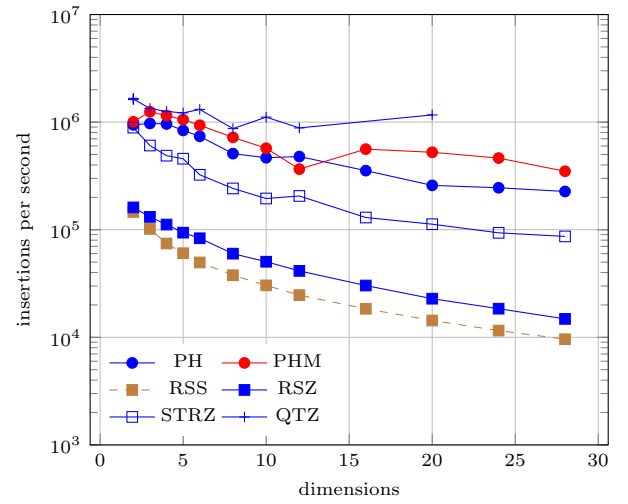
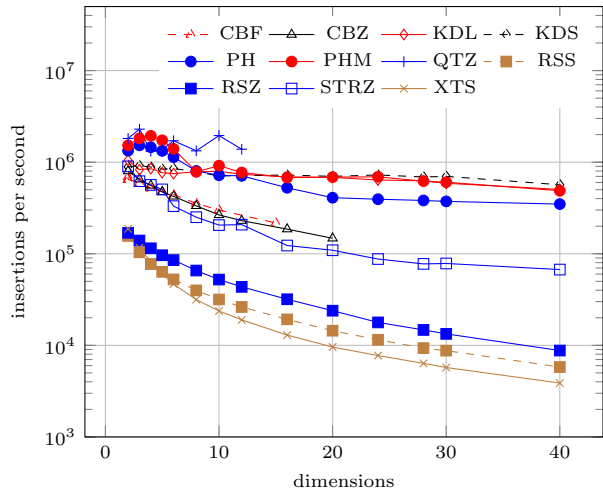
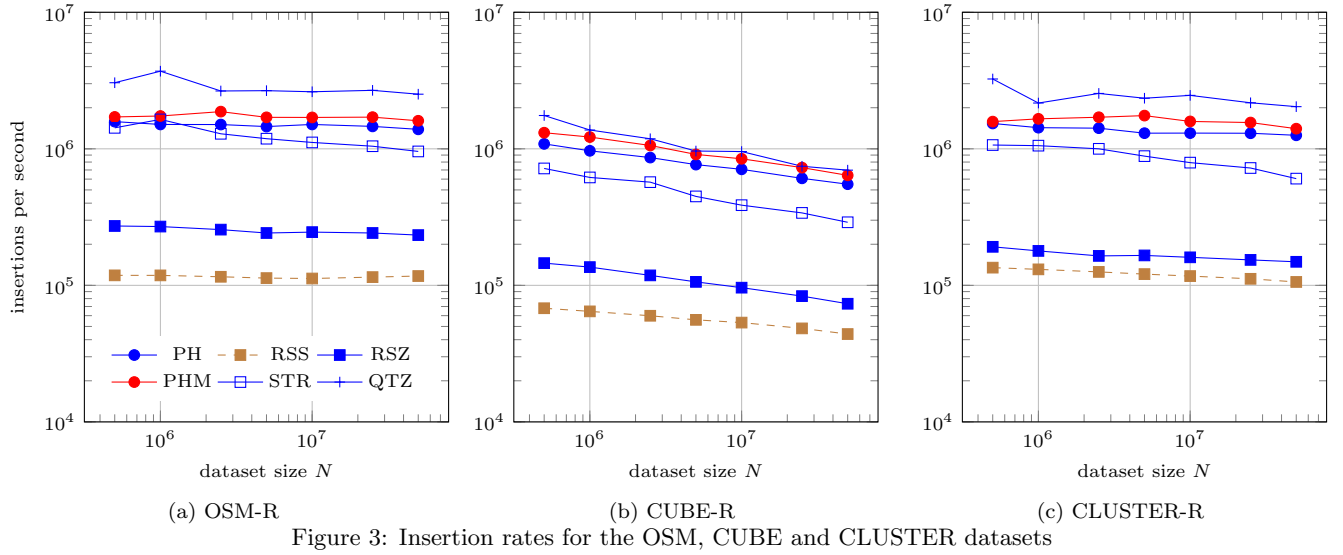
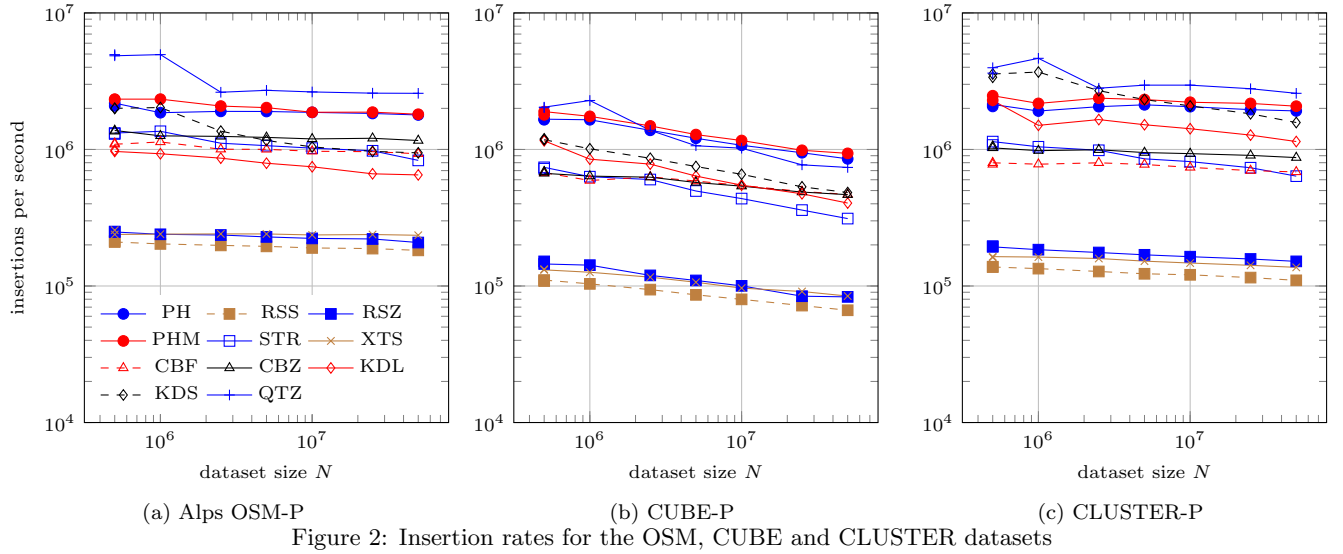
The synthetic CL-P/CL-R datasets (Fig. 1b) consists of 1000 clusters that are distributed uniformly at random between 0.0 and 1.0. In each cluster, elements follow a Gaussian distribution with standard deviation $\sigma = 0.001$. The CLUSTER dataset contains up to 50,000,000 elements.

4. RESULTS

Results are shown on in the following order:

- Insertion: Figures 2 – 7
- Memory usage: Figures 8 – 13
- Window queries: Figures 14 – 21
- Exact match queries (point queries): Figures 22 – 27
- k NN queries: Figures 28 – 39
- Update: Figures 40 – 45
- Remove: Figures 46 – 51

⁸<http://download.geofabrik.de/europe/alps.html>



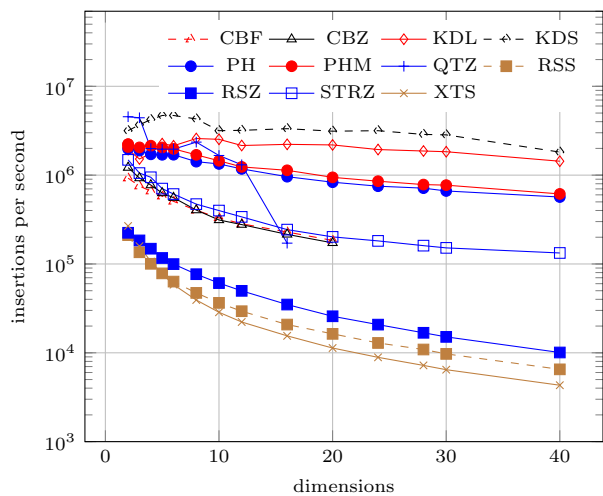


Figure 6: DIM: Insertion rates for CL-P

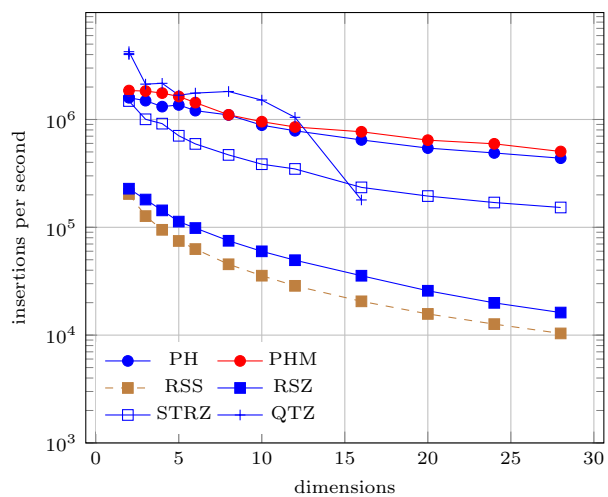
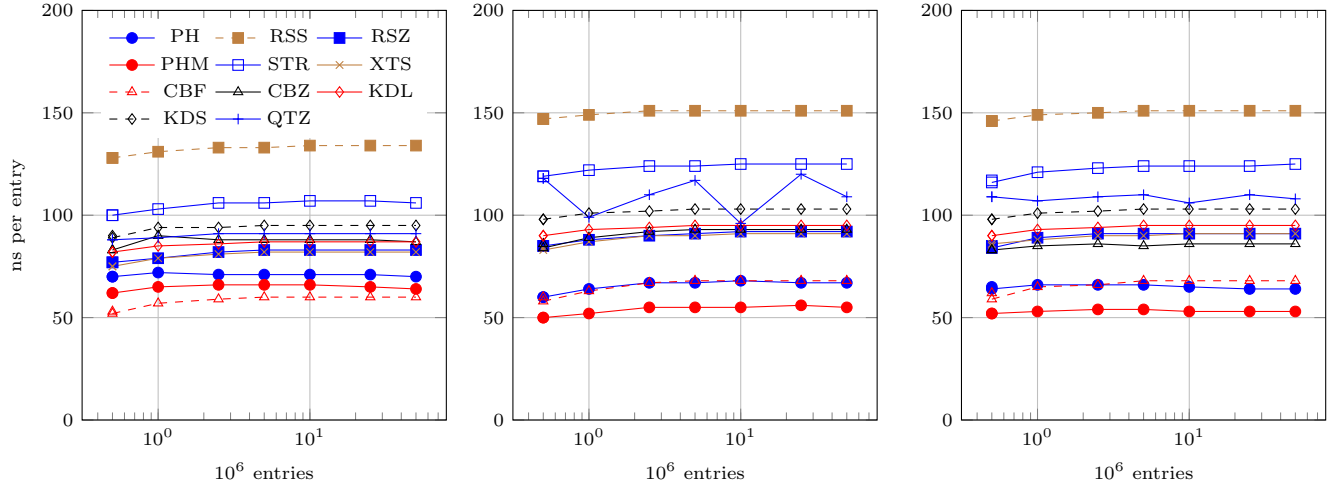


Figure 7: DIM: Insertion rates for CL-R

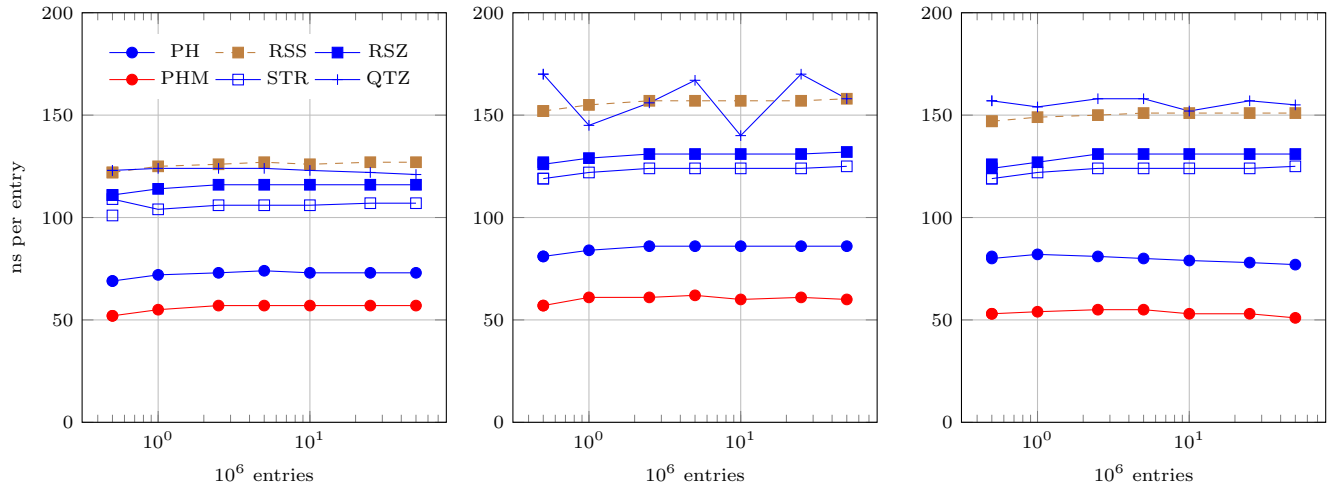


(a) Alps OSM-P

(b) CUBE-P

(c) CLUSTER-P

Figure 8: Memory usage per point entry for the OSM Alps, CUBE and CLUSTER datasets



(a) Alps OSM-R

(b) CUBE-R

(c) CLUSTER-R

Figure 9: Memory usage per rectangle entry for the OSM Alps, CUBE and CLUSTER datasets

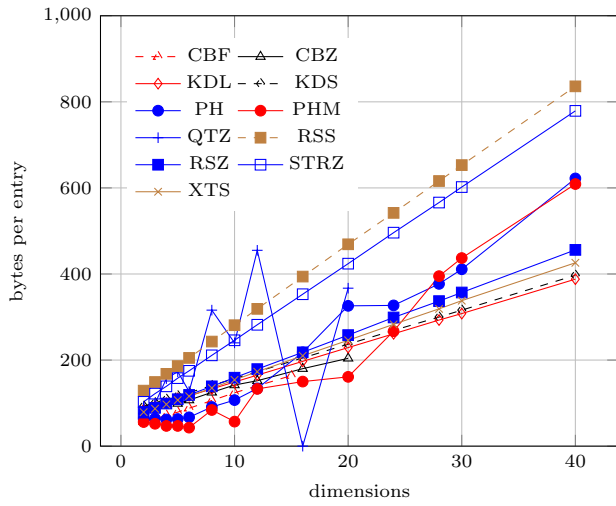


Figure 10: DIM: Memory usage per point for CU-P

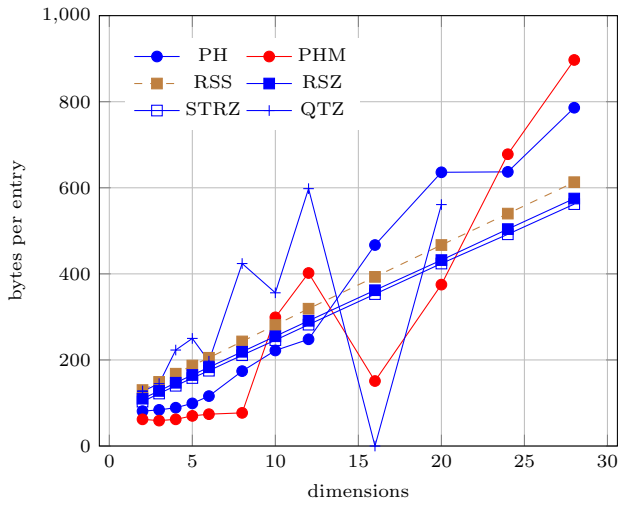


Figure 11: DIM: Memory usage per rectangle for CU-R

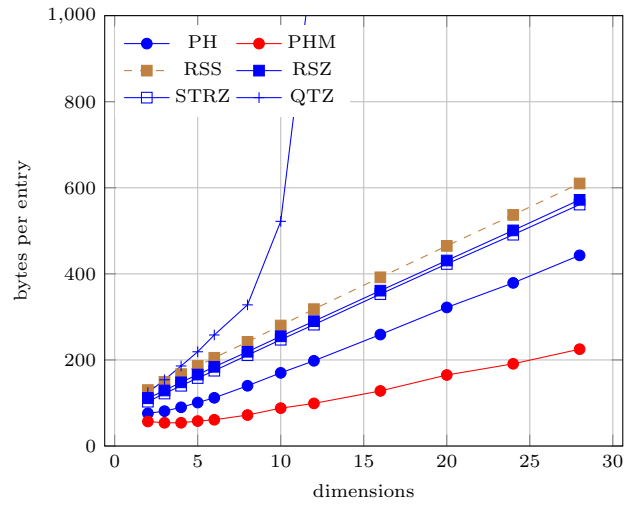


Figure 13: DIM: Memory usage per rectangle for CL-R

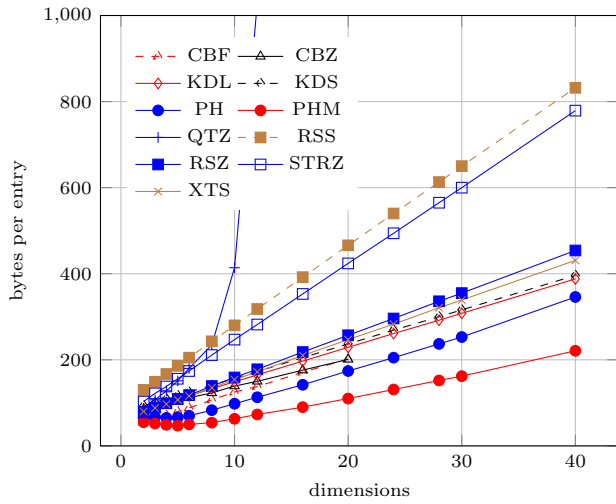
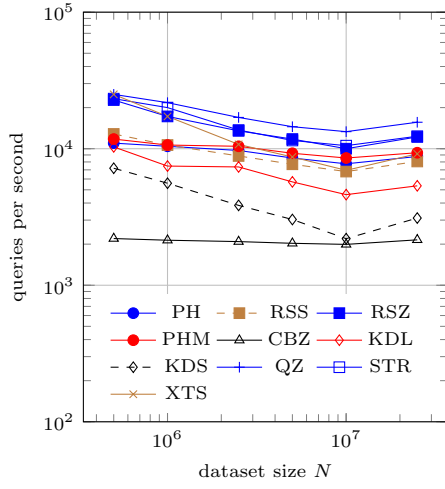
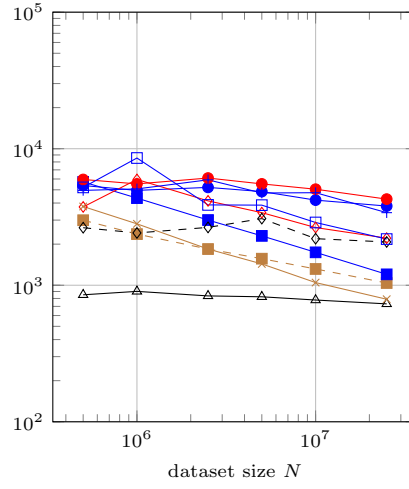


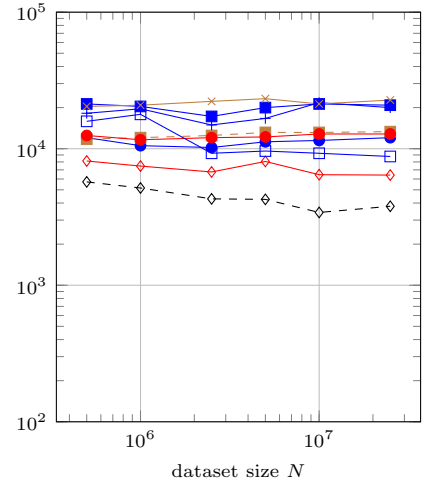
Figure 12: DIM: Memory usage per point for CL-P



(a) 2D OSM-P

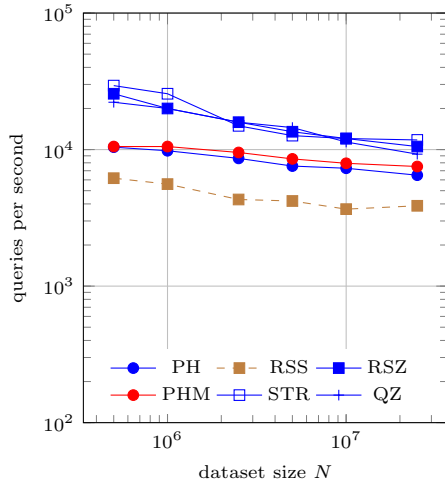


(b) 3D CUBE-P

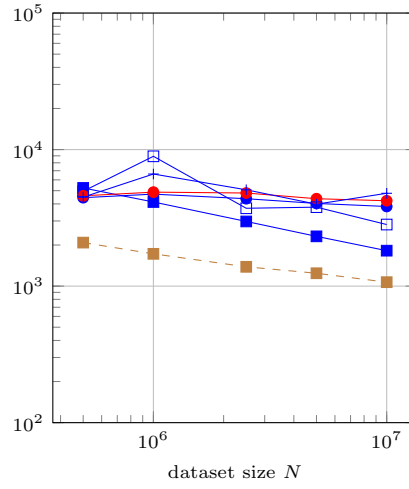


(c) 3D CLUSTER-P

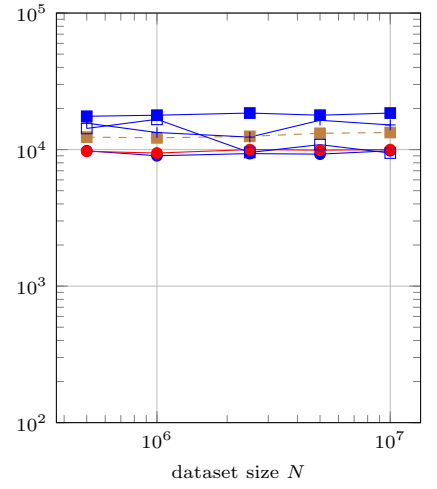
Figure 14: Window query rates for the OSM, CUBE and CLUSTER datasets



(a) Alps OSM-R

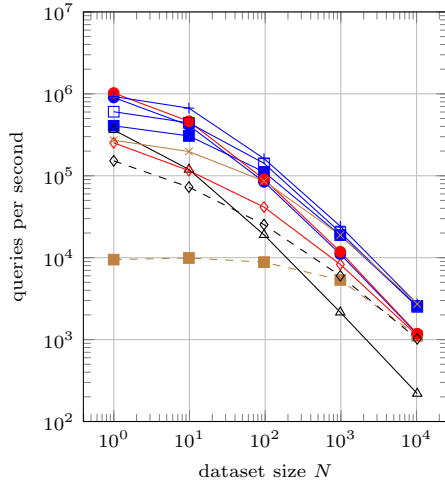


(b) CUBE-R

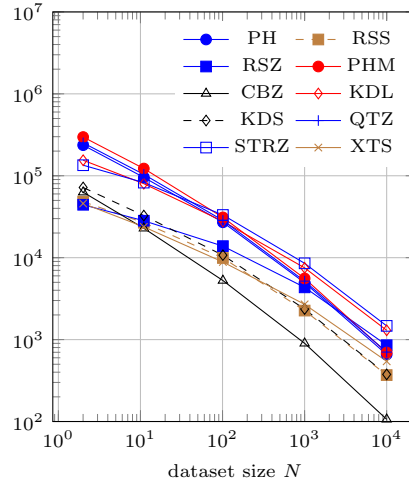


(c) CLUSTER-R

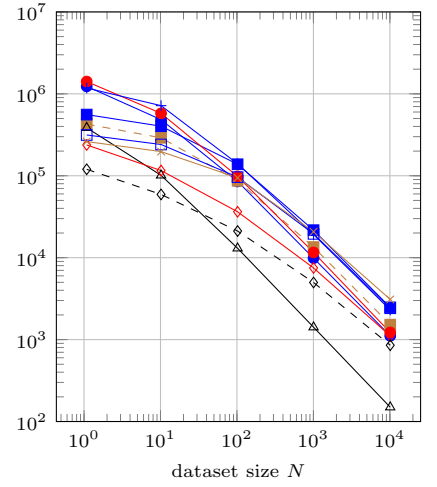
Figure 15: Window query rates for the OSM, CUBE and CLUSTER datasets



(a) 2D OSM-P

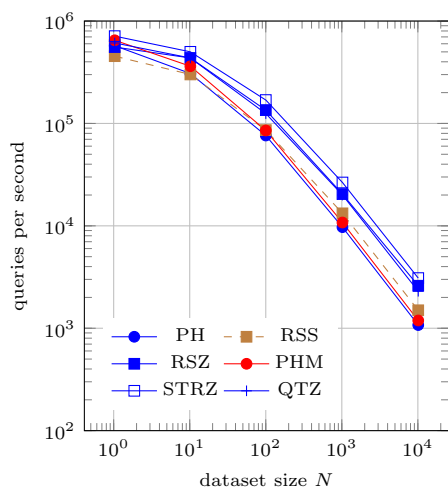


(b) 3D CUBE-P

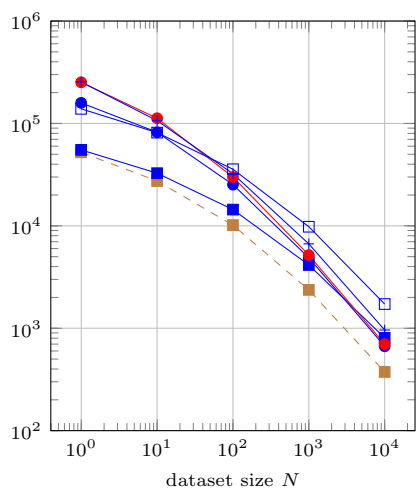


(c) 3D CLUSTER-P

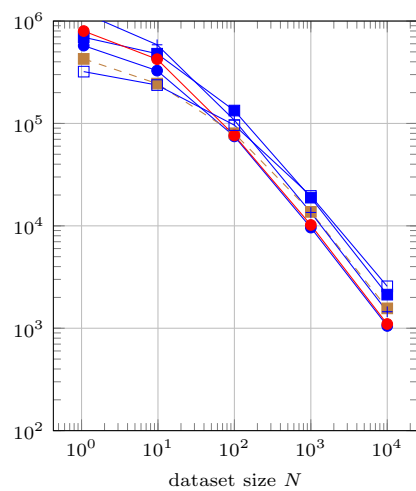
Figure 16: Varying query result size with the OSM Alps, CUBE and CLUSTER datasets



(a) Alps OSM-R



(b) CUBE-R



(c) CLUSTER-R

Figure 17: Varying query result size with the OSM Alps, CUBE and CLUSTER datasets

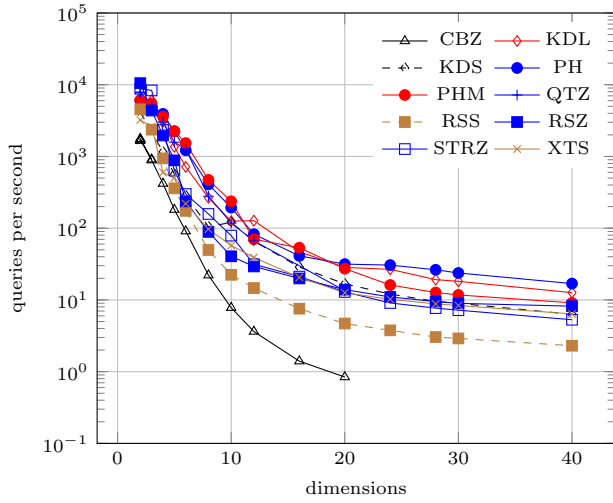


Figure 18: DIM: Window query rates for CU-P

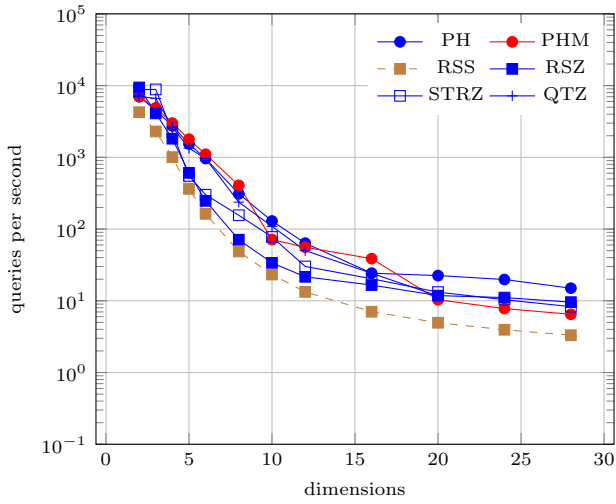


Figure 19: DIM: Window query rates for CU-R

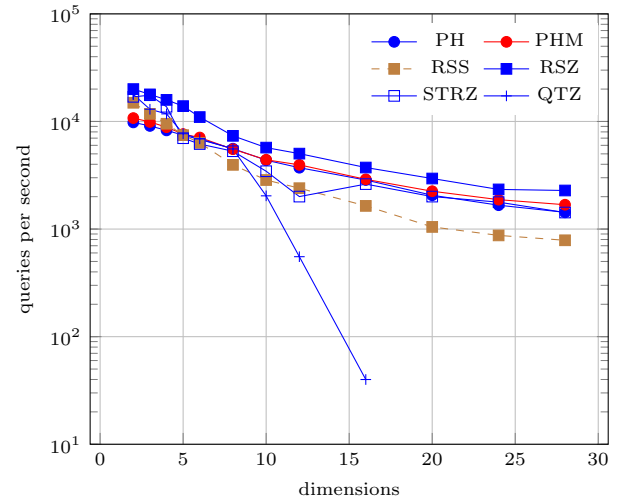


Figure 21: DIM: Window query rates for CL-R

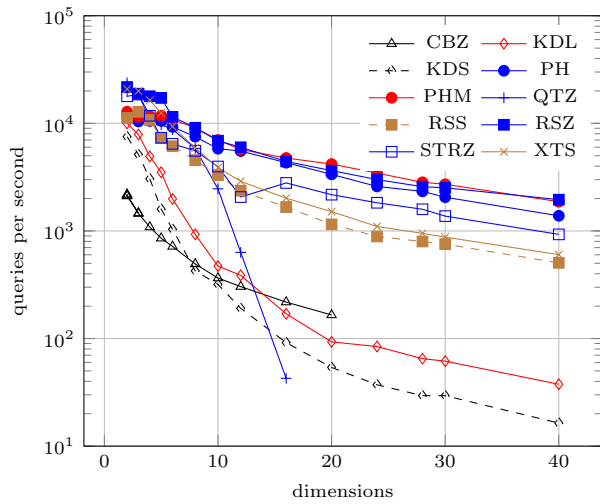
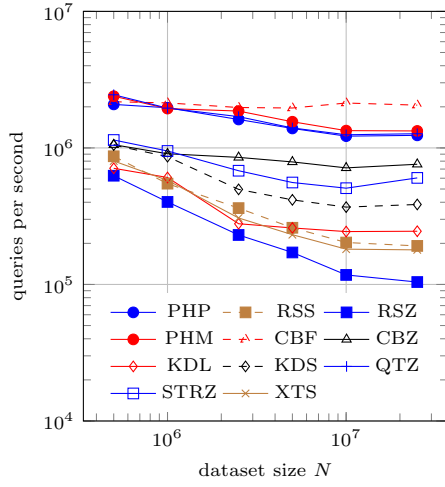
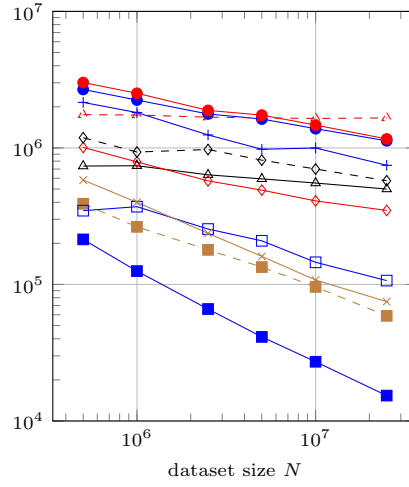


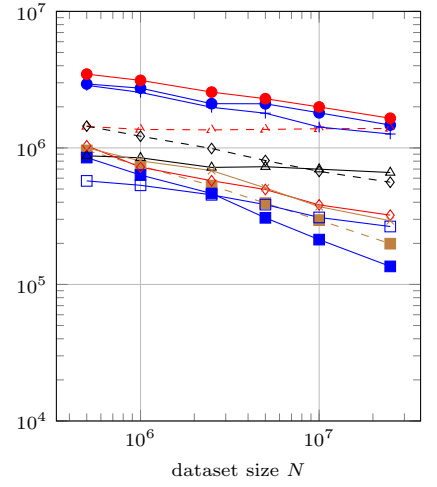
Figure 20: DIM: Window query rates for CL-P



(a) 2D OSM-P

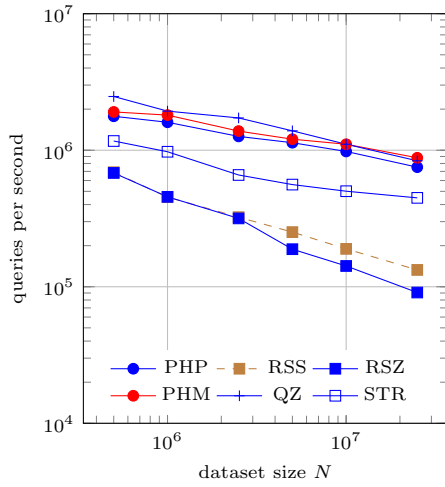


(b) 3D CUBE-P

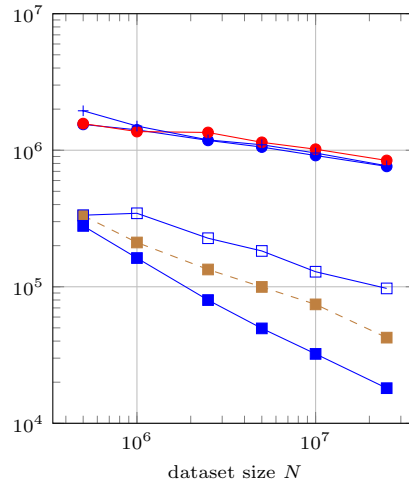


(c) 3D CLUSTER-P

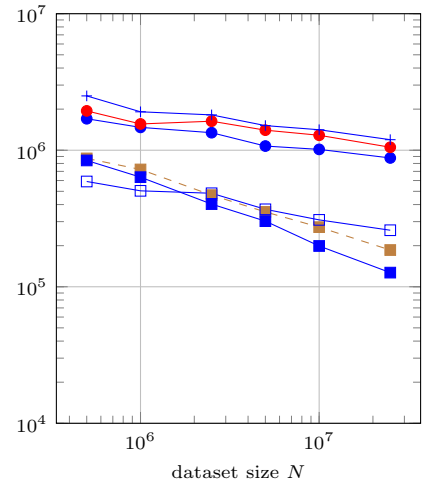
Figure 22: Exact match query rates for the OSM, CUBE and CLUSTER datasets



(a) 2D OSM-R



(b) 3D CUBE-R



(c) 3D CLUSTER-R

Figure 23: Exact match query rates for the OSM, CUBE and CLUSTER datasets

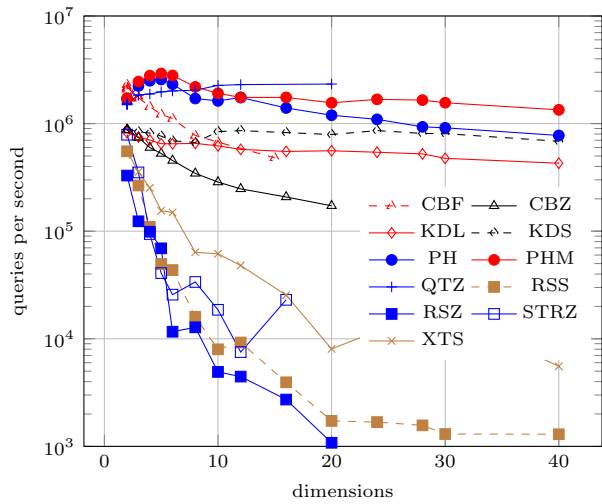


Figure 24: DIM: Exact match query rates for CU-P

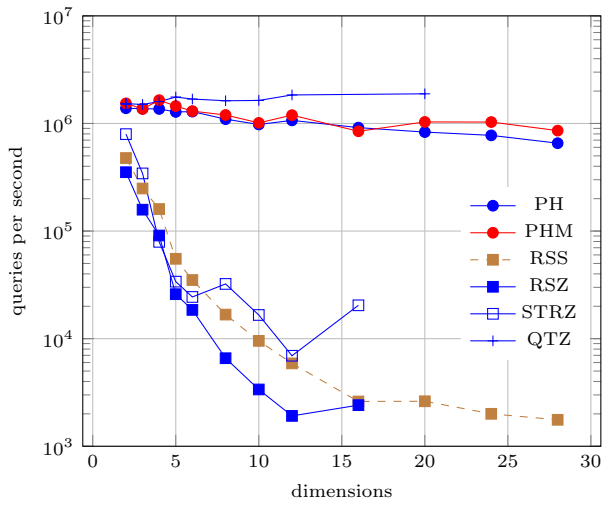


Figure 25: DIM: Exact match query rates for CU-R

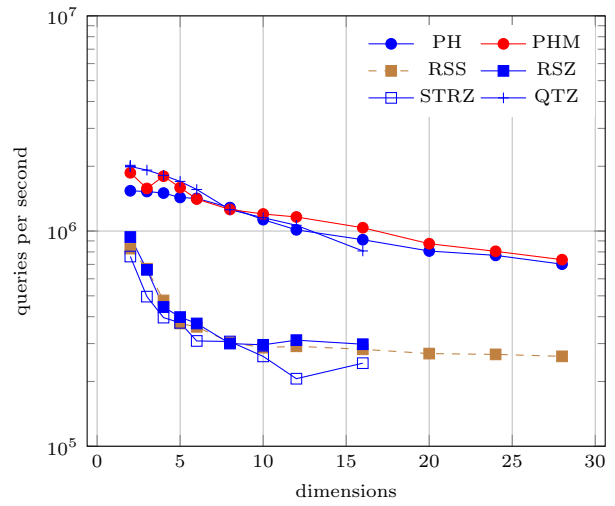


Figure 27: DIM: Exact match query rates for CL-R

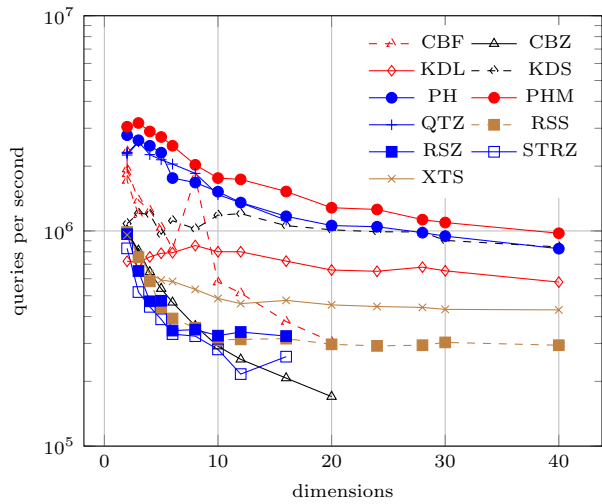
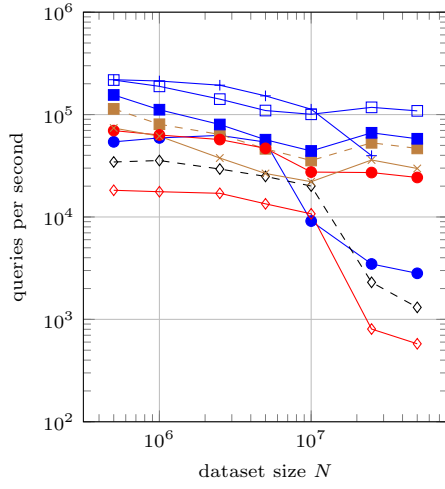
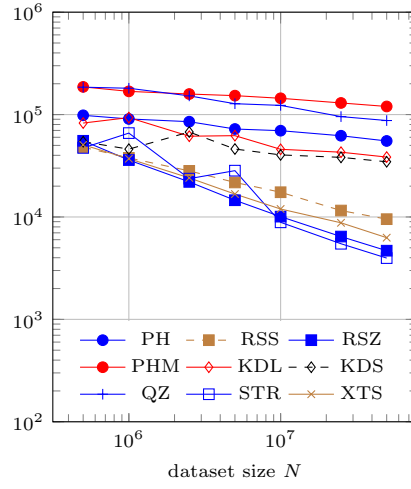


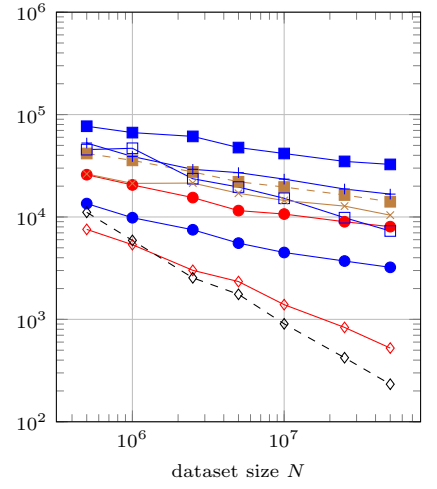
Figure 26: DIM: Exact match query rates for CL-P



(a) 2D OSM-P

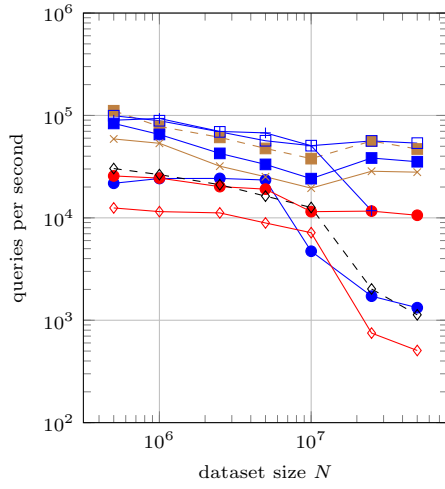


(b) 3D CUBE-P

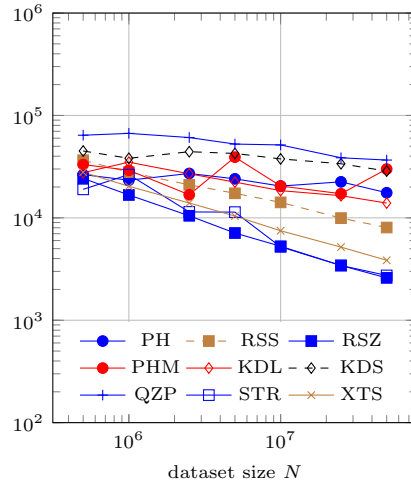


(c) 3D CLUSTER-P

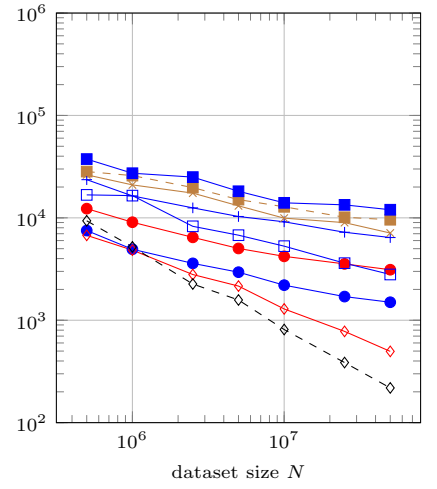
Figure 28: 1NN query rates for the OSM, CUBE and CLUSTER datasets



(a) 2D OSM-P

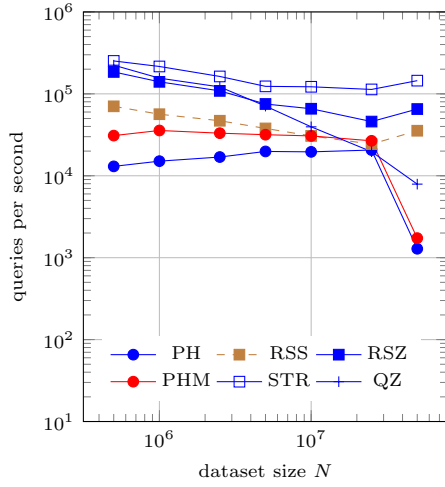


(b) 3D CUBE-P

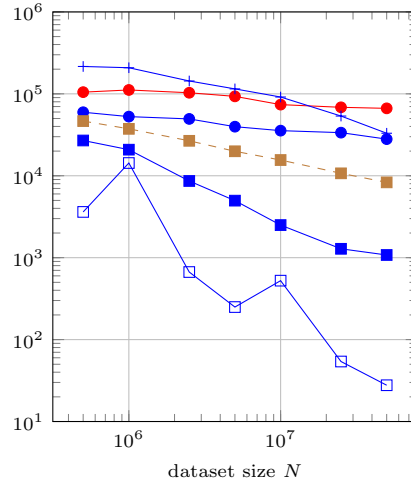


(c) 3D CLUSTER-P

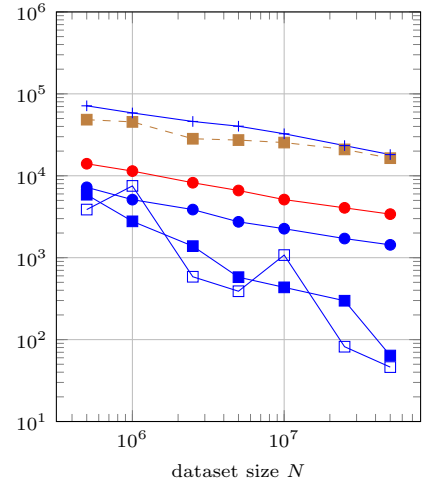
Figure 29: 10NN query rates for the OSM, CUBE and CLUSTER datasets



(a) OSM-R

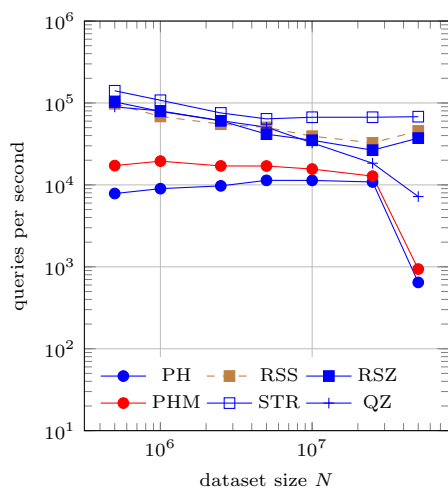


(b) CUBE-R

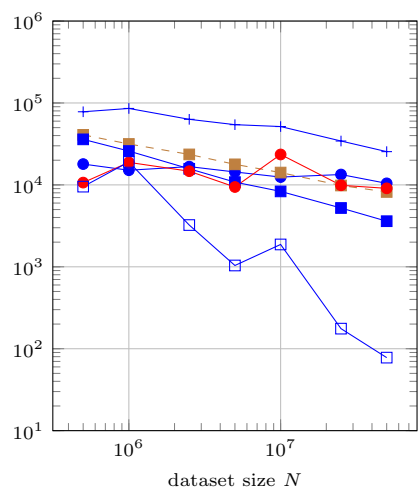


(c) CLUSTER-R

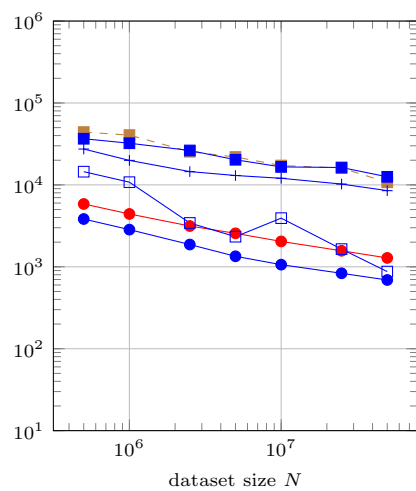
Figure 30: 1NN query rates for the OSM, CUBE and CLUSTER datasets



(a) OSM-R



(b) CUBE-R



(c) CLUSTER-R

Figure 31: 10NN query rates for the OSM, CUBE and CLUSTER datasets

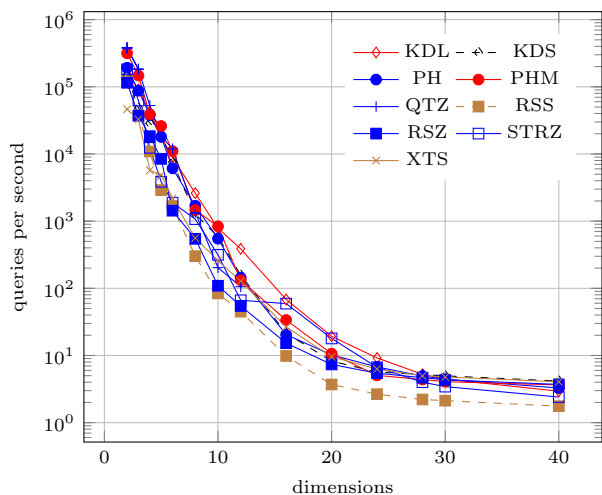


Figure 32: DIM: 1-NN query rates for CU-P

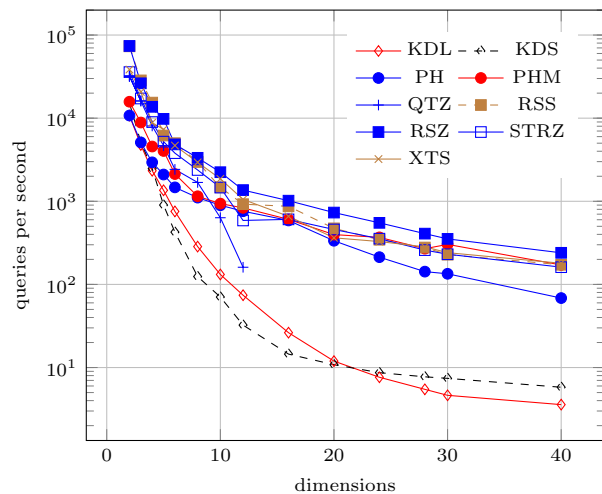


Figure 35: DIM: 10-NN query rates for CL-P

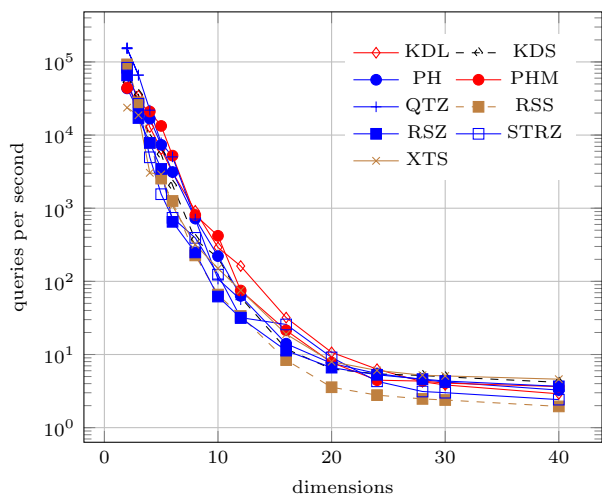


Figure 33: DIM: 10-NN query rates for CU-P

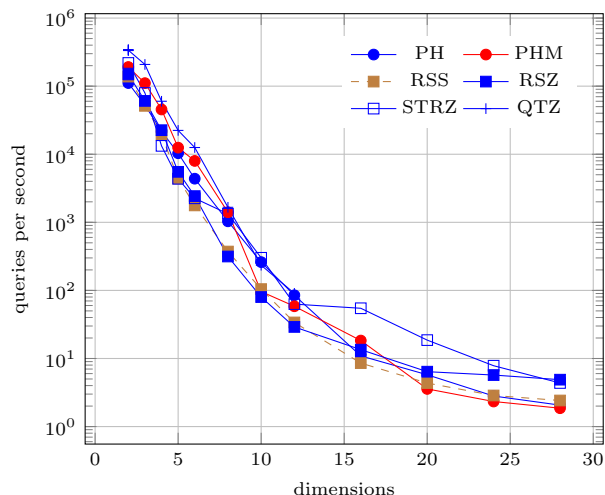


Figure 36: DIM: 1-NN query rates for CU-R

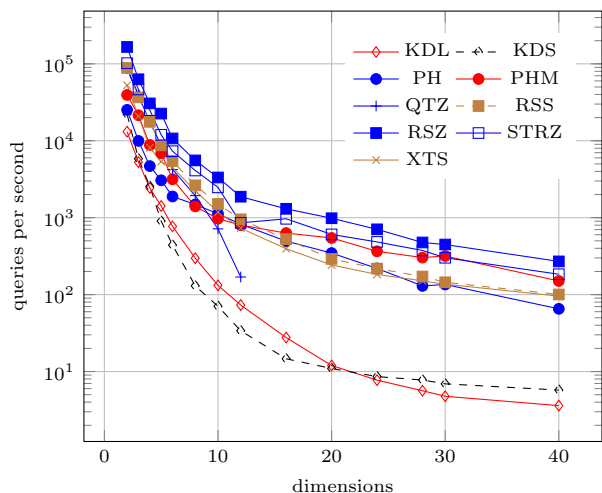


Figure 34: DIM: 1-NN query rates for CL-P

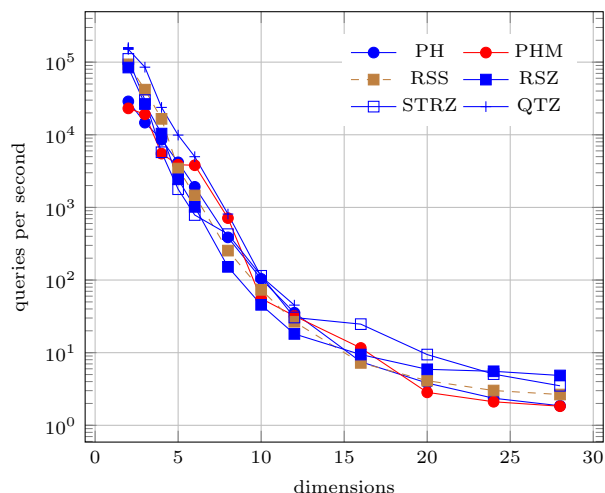


Figure 37: DIM: 10-NN query rates for CU-R

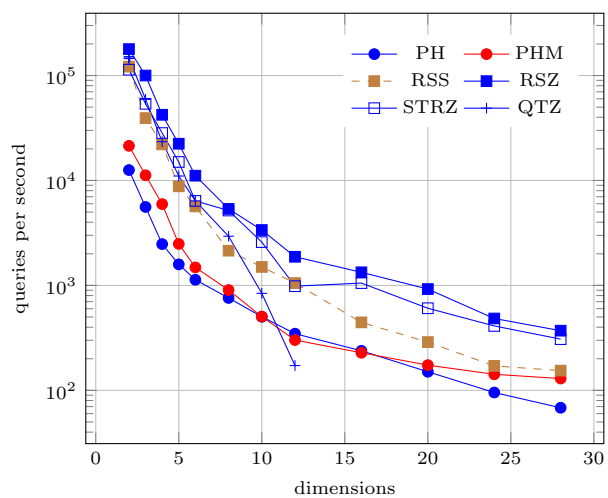


Figure 38: DIM: 1-NN query rates for CL-R

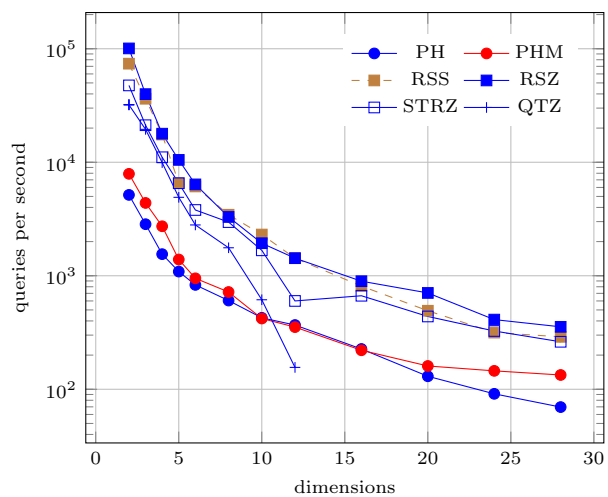
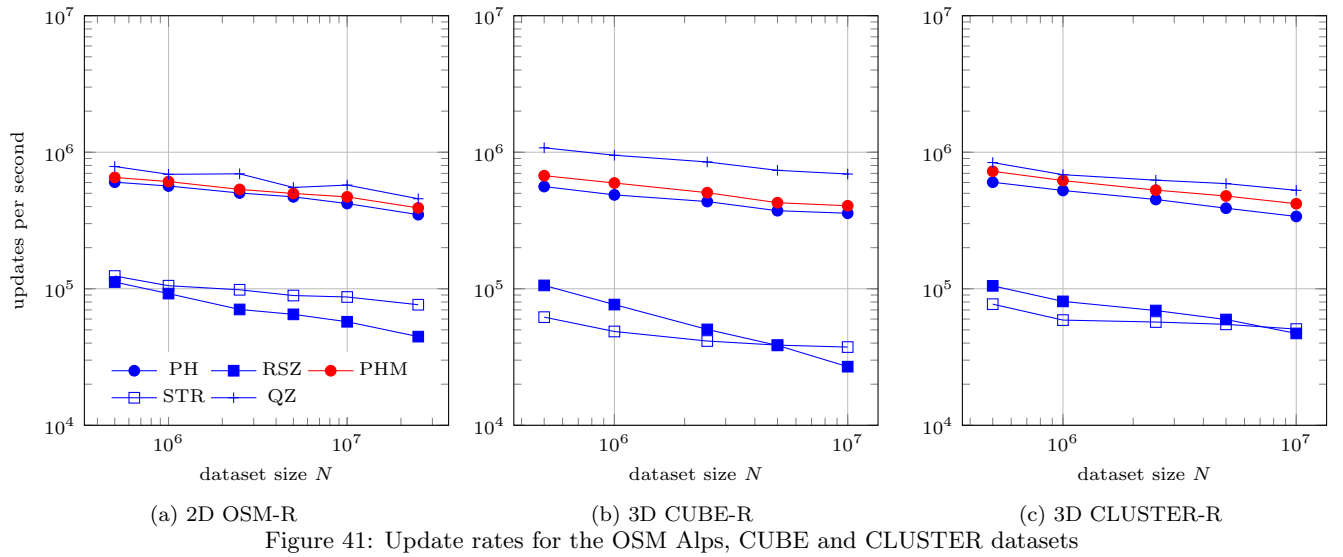
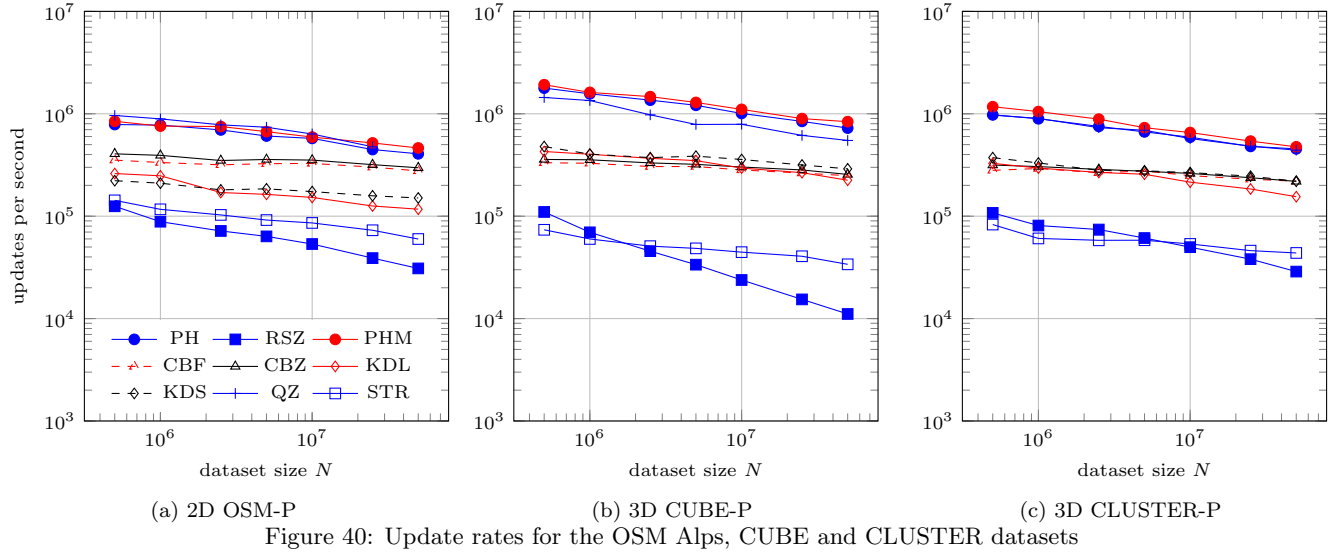


Figure 39: DIM: 10-NN query rates for CL-R



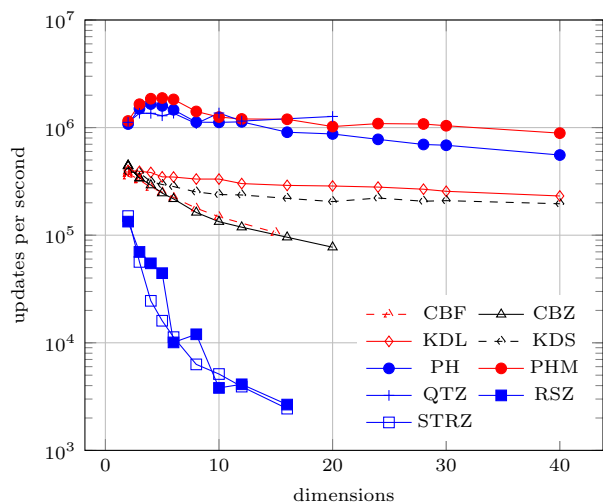


Figure 42: DIM: Update rates for CU-P

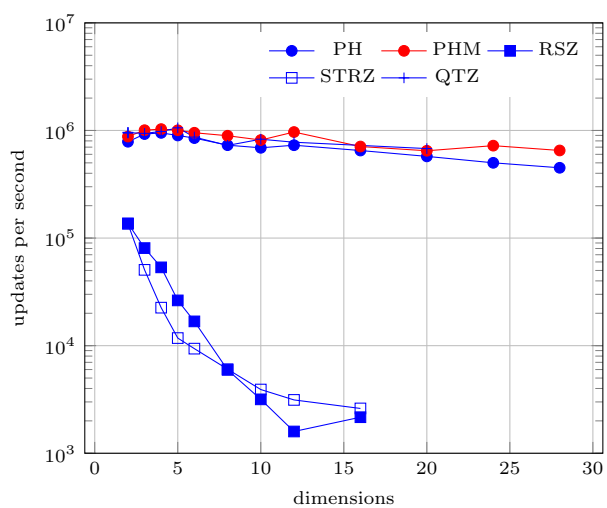


Figure 43: DIM: Update rates for CU-R

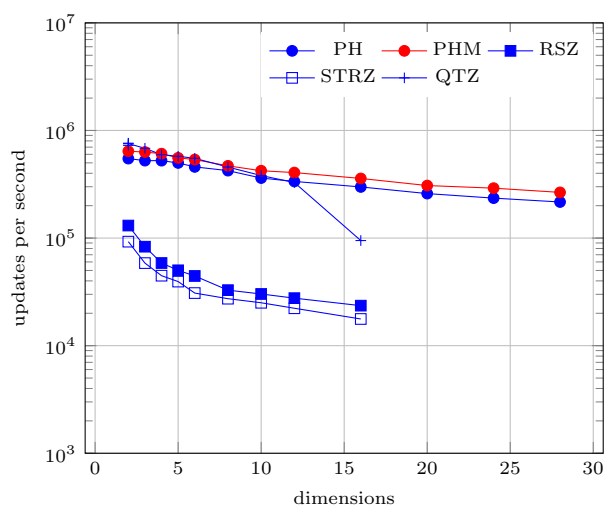


Figure 45: DIM: Update rates for CL-R

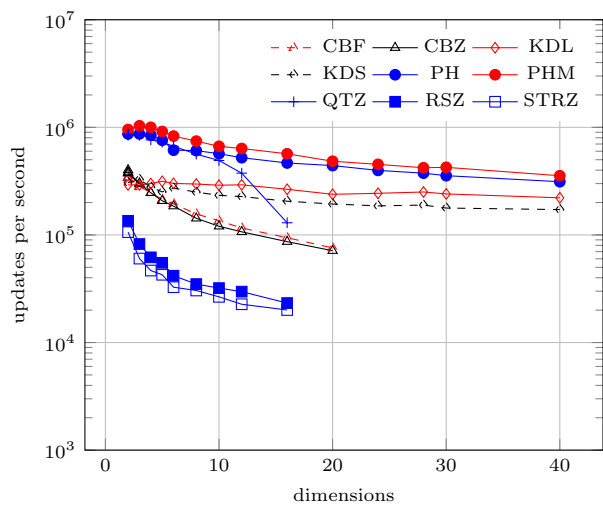


Figure 44: DIM: Update rates for CL-P

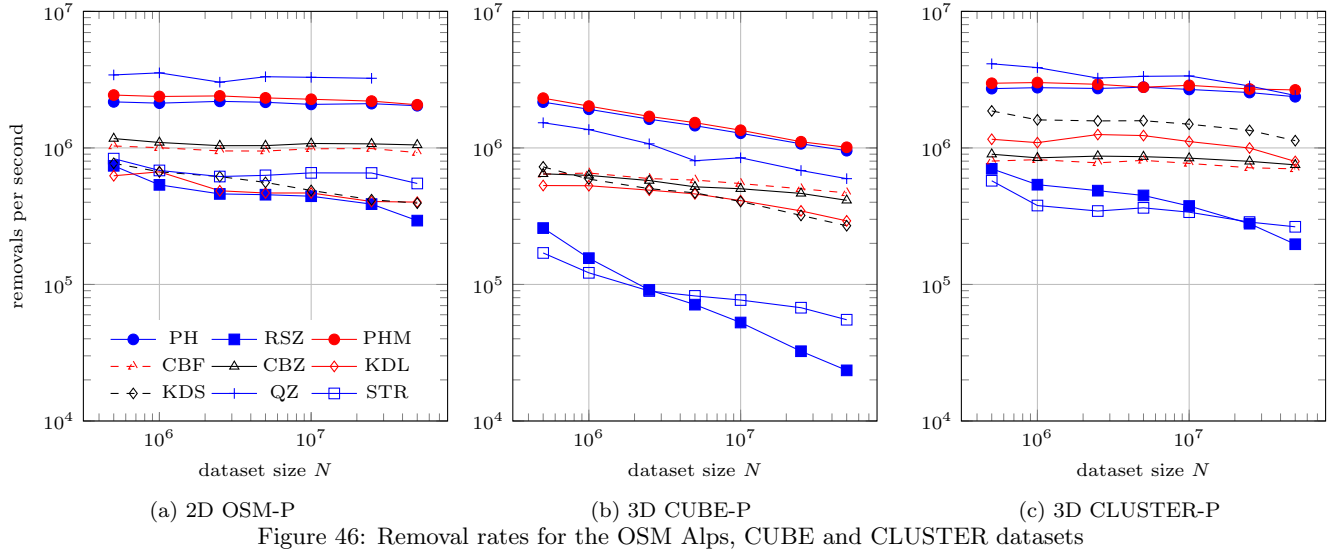


Figure 46: Removal rates for the OSM Alps, CUBE and CLUSTER datasets

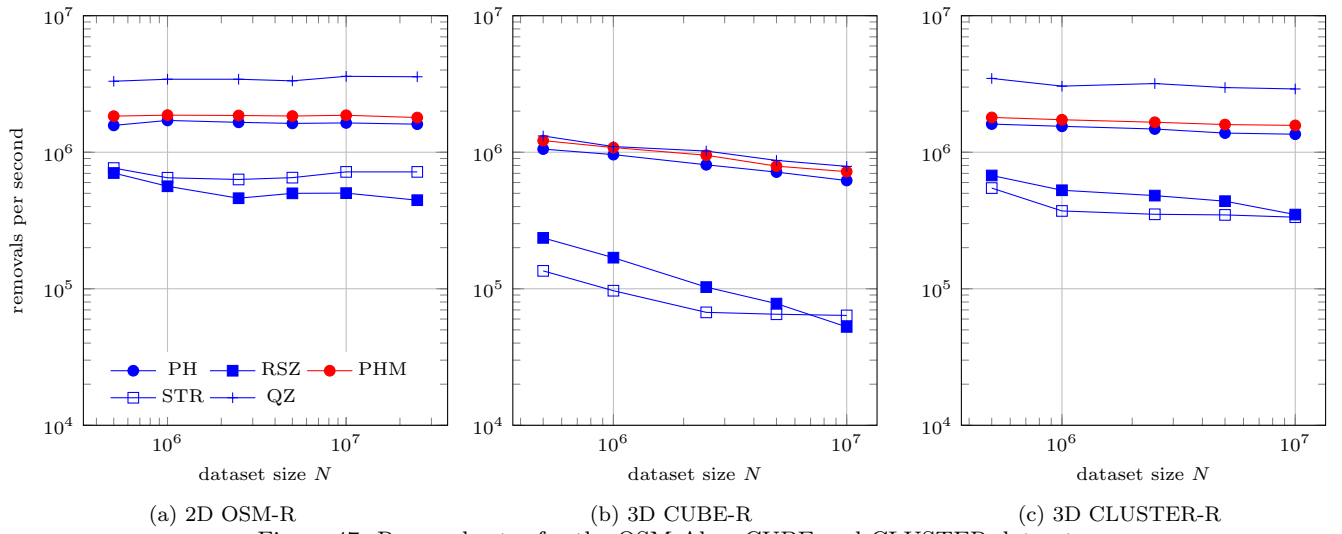


Figure 47: Removal rates for the OSM Alps, CUBE and CLUSTER datasets

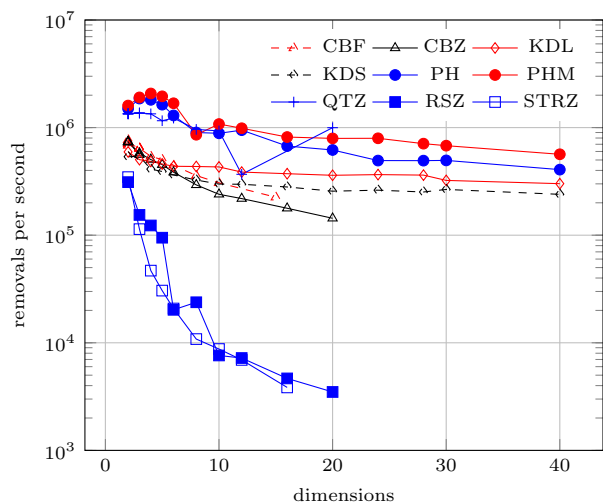


Figure 48: DIM: Removal rates for CU-P

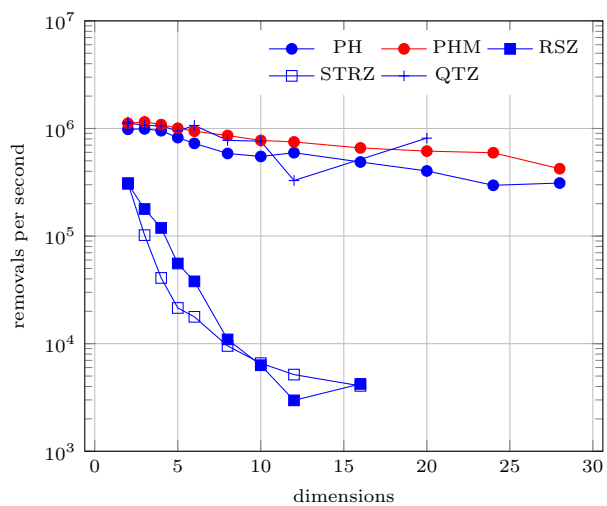


Figure 49: DIM: Removal rates for CU-R

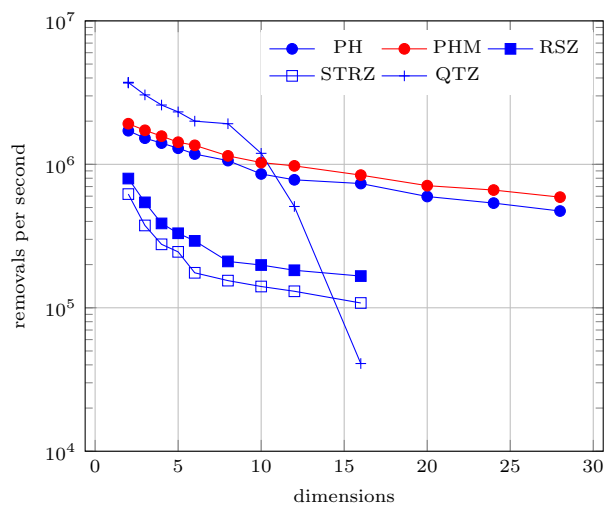


Figure 51: DIM: Removal rates for CL-R

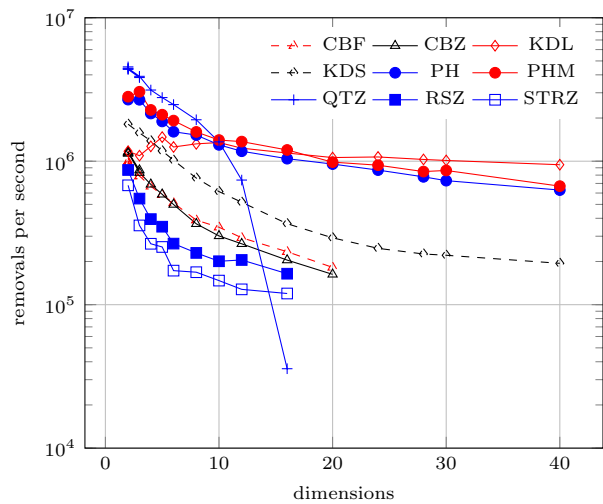


Figure 50: DIM: Removal rates for CL-P