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Exhibit 47

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LSH Algorithm and Implementation (E2LSH)

Locality-Sensitive Hashing (LSH) is an algorithm for solving the (approximate/exact) Near Neighbor Search in high dimensional spaces. On this webpage, you will find pointers to the newest LSH algorithm in Euclidean (I_2) spaces, as well as the description of the **E2LSH package**, an implementation of this new algorithm for the Euclidean space.

• Algorithm description:

DOCKE

- CACM survey of LSH (2008): "Near-Optimal Hashing Algorithms for Approximate Nearest Neighbor in High Dimensions" (by Alexandr Andoni and Piotr Indyk). <u>Communications of the</u> <u>ACM, vol. 51, no. 1, 2008, pp. 117-122.</u> <u>directly from CACM</u> (for free). <u>local copy</u> (see <u>CACM disclaimer</u>).
- Most recent algorithm (2006): "Near-Optimal Hashing Algorithms for Near Neighbor Problem in High Dimensions" (by Alexandr Andoni and Piotr Indyk). In Proceedings of the Symposium on Foundations of Computer Science (FOCS'06), 2006.

Slides: Here are some slides on the LSH algorithm from a talk given by Piotr Indyk.

• Earlier algorithm for Euclidean space (2004): a good introduction to LSH, and the description of affairs as of 2005, is in the following book chapter

<u>Locality-Sensitive Hashing Scheme Based on p-Stable Distributions</u> (by Alexandr Andoni, Mayur Datar, Nicole Immorlica, Piotr Indyk, and Vahab Mirrokni), appearing in the book <u>Nearest Neighbor</u> <u>Methods in Learning and Vision: Theory and Practice, by T. Darrell and P. Indyk and G.</u> Shakhnarovich (eds.), MIT Press, 2006.

See also the book introduction for a smooth introduction to NN problem and LSH.

- Original LSH algorithm (1999): the best algorithm for the Hamming space remains the one described, e.g, in [GIM'99] paper.
- Implementation of LSH: Currently, we only have an alpha-version available the E2LSH package. The code is based on the algorithm described in the book chapter (2006) from above. <u>Download the code</u>.

You can also download the **manual** for the code to see its functionality. The code has been developed by Alex Andon in 2004-2005.

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