

Journal Papers

Conference Papers

Tutorials

Open Problems

Relevant Technical Reports

Theses

Journal Papers

- J63 Warmuth, M. K., and Kuzmin, D. (2009), “Bayesian Generalized Probability Calculus for Density Matrices”, *Journal of Machine Learning*, to appear. Preliminary digital publication: DOI 10.1007/s10994-009-5133-7, Springer, Friday, July 24, 2009. [\[PDF\]](#)
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- J61 Warmuth, M. K., and Kuzmin, D. (2008), “Randomized Online PCA Algorithms with Regret Bounds that are Logarithmic in the Dimension”, *Journal of Machine Learning Research*, vol. 9, pp. 2217-2250, October 2008. [\[PDF\]](#)
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