الجمهورية الشعبية الديمقراطية الجزائرية République Algérienne Démocratique et Populaire وزارة التعليم العالي و البحث العلمي Ministère de l'Enseignement Supérieur et de la Recherche Scientifique المدرسة العليا للإعلام الآلي ٥8٠ ماي 1945. بسيدي بلعباس École Supérieure en Informatique, 08 Mai 1945- Sidi Bel Abbès

HIGHER SCHOOL OF COMPUTER SCIENCE, 08 MAY 1945 - SIDI BEL ABBES



Field: Computer Science Specialty: Artificial Intelligence and Data Science

## Analysis of Multi-View Majority Vote Learning Algorithms Through PAC-Bayesian Bounds

Prepared by: Abdelkrim Zitouni

Supervised by: Souleyman Chaib Khalid Benabdeslem Mehdi Hennequin

Date: June 30, 2024

In front of the jury composed of:

Mr. Belkacem Khaldi

Mr. Mohamed Bekkouche

Mr. Souleyman Chaib

Mr. Khalid Benabdeslem

President Examiner Supervisor Co-Supervisor

Submitted in fulfilment of the requirements for the MSc Diploma of ESI-SBA

## Abstract

The PAC-Bayesian framework has significantly advanced our understanding of statistical learning's generalization capabilities, particularly through majority voting methods. However, its application within multi-view learning remains underexplored. This manuscript extends PAC-Bayesian analysis to address the complexities of multi-view scenarios in majority voting. We introduce novel multi-view PAC-Bayesian bounds that incorporate Rényi divergence as a nuanced complexity measure, replacing the traditional Kullback-Leibler divergence. Furthermore, we refine our theoretical framework by advancing both first and second-order bounds, as well as the C-bound. These theoretical advancements provide a robust foundation for developing generalizable machine learning models in multi-view contexts.

**Keywords**— majority vote, multi-view, ensemble methods, learning theory, PAC-Bayesian theory, Rényi divergence