

Comité de suivi Individuel

Réinscription en 3ème année de thèse

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encadrement: Nicolas Verzelen[†] et Alexandra Carpentier*

8 juillet 2025

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Bilan scientifique

Project 1 – Clustering with bandit feedback

Project 2 – Clustering with Bandit Feedback (entry by entry)

Project 3 – Condorcet Winner Identification

Bilan globale

Séminaires et conférences

Formation à l'ED

Enseignement

Bilan scientifique

Pure exploration over a matrix (with bandit feedback)

- **matrix environment** – M is an $n \times d$ matrix,

$$M = \begin{bmatrix} M_{1,1} & \cdots & M_{1,j} & \cdots & M_{1,d} \\ \vdots & & \vdots & & \vdots \\ M_{i,1} & \cdots & M_{i,j} & \cdots & M_{i,d} \\ \vdots & & \vdots & & \vdots \\ M_{n,1} & \cdots & M_{n,j} & \cdots & M_{n,d} \end{bmatrix}$$

- **learning protocol** – a learner observes¹ sequentially and adaptively a subset of the entries of M
- **unknown structure** – unknown structure over the matrix
- **objective** – (a) recover the unknown structure w.h.p, while
(b) minimize the budget²

1. with some sub-Gaussian noise
2. total number of observations – chosen by the learner

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Project 1 – Clustering with bandit feedback

Problem

- **Observations** – one entire row (dimension d) at a time
- **Unknown structure** – there exists a partition of the rows G^* into K groups, so that, two rows μ_i and μ_j are in the same group, iff $\mu_i = \mu_j$.

$$M = \begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 & 0 \\ 5 & 5 & 5 & 5 & 5 & 5 \\ 5 & 5 & 5 & 5 & 5 & 5 \\ 0 & 0 & 1 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix} \left\{ \begin{array}{l} \mu_1 \\ \mu_2 \\ \mu_3 \\ \mu_3 \\ \mu_2 \\ \mu_1 \end{array} \right.$$

- **Objective** – recover G^* with probability larger than $1 - \delta$

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Advancement ⌚

- (23/24) bibliography ⌚ – algorithms ⌚ (construction and analysis) – lower bound, optimality ⌚ – numerical experiment ⌚ – redaction and submission ICML, Neurips 🚫 (rejected)
- (24/25-s1) revision of the paper ⌚ – publication³ for ALT (February, Milan) 📄
- (25/26) improve lower bound ⌚ – extension to nonparametric setting (in RKHS) ⌚? (joint work with Sebastian Vogt, and Debarghya Ghoshdastidar)

3. Victor Thuot et al. “**Clustering with bandit feedback: breaking down the computation/information gap**”. In: *Proceedings of The 36th International Conference on Algorithmic Learning Theory*. PMLR.

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Project 2 – Clustering with Bandit Feedback (entry by entry)

*joint work with Maximilian Graf– PhD student in Potsdam

Problem

- **Observations** – one entry $(I_j, J_t) \in [n] \times [d]$ at a time
- **Unknown structure** – there exists a partition of the rows G^* , so that, two rows μ_i and μ_j are in the same group, iff $\mu_i = \mu_j$,
restriction to two groups

$$M = \begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0.5 & 0.05 & 0 \\ 0 & 1 & 0 & 0.5 & 0.05 & 0 \\ 0 & 1 & 0 & 0.5 & 0.05 & 0 \\ 0 & 1 & 0 & 0.5 & 0.05 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0.5 & 0.05 & 0 \end{bmatrix} \begin{cases} \mu_0 \\ \mu_1 \\ \mu_1 \\ \mu_1 \\ \mu_1 \\ \mu_0 \\ \mu_1 \end{cases}$$

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Advancement

- (2023/2024–s2) bibliography on pure exploration ⌚ – algorithm, upper bound ($K = 2$) ⌚ – lower bound ($K = 2$) ⌚
- (2024/2025) algorithm, upper bound ($K = 2$) ⌚ – numerical experiments (Max) ⌚ – lower bound, optimality ($K = 2$) ⌚ (but room for improvement) – redaction, submission, and correction ⌚ – publication⁴ ICML (Vancouver July) 📄
- (2025/2026) improved lower bound ⌚ – extension to $K > 2$ groups ⌚?

4. Maximilian Graf, Victor Thuot, and Nicolas Verzelen. *Clustering Items through Bandit Feedback: Finding the Right Feature out of Many*. Accepted at the 42nd International Conference on Machine Learning. 2025. arXiv: 2503.11209 [stat.ML].

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Project 3 – Condorcet Winner Identification

*joint work with El Mehdi Saad – Kaust

Problem

- **Observations** – one comparison between two items
 $(I_j, J_t) \times [d]$
- **Unknown structure** – $M - \frac{1}{2}I$ antisymmetric, there exists a **Condorcet Winner** such that $M_{i_*,j} > 1/2$ for each j

$$M = \begin{bmatrix} 0.8 & 0.9 & 0.7 & 0.85 \\ 0.1 & 0.5 & 0.3 & 0.6 \\ 0.2 & 0.6 & 0.5 & 0.4 \\ 0.3 & 0.4 & 0.7 & 0.5 \end{bmatrix}$$

- **Objective** – recover the Condorcet winner w.h.p

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Advancement

- (2023/2024-s2) bibliography on dueling bandit ⌚ – algo ⌚
- (2024/2025- s2) lower bound ⌚
- (2025/2026) submission to a conference ?

Bilan globale

Conférences et séminaires en 1ère année

- Conférence StatMatAppli 2023
Fréjus, France – 17 au 22 sept 2023
- Workshop on Bandits and Statistical Tests
Potsdam, Allemagne – 24 au 25 nov 2023
- 3rd ASCAI Workshop in Potsdam
Potsdam, Allemagne – 20 au 21 fev 2024
 - * Présentation projet [1]
- Amazon StatML Workshop 2024
Berlin, Allemagne – 15 au 17 avril 2024
- Séminaires ML-MTP
Montpellier, France – 02 mai 2024
 - * Présentation projet [1]

Conférences et séminaires en 2ème année

- **36th International Conference on Algorithmic Learning Theory**
Milan, Italie – 24 au 27 février 2025
 - * Présentation orale et poster – **Publication** du papier [1]
- **German Probability and Statistics Days 2025 (GPSD)**
Dresde, Allemagne – 11 au 14 mars 2025
 - * Présentation projet [2]
- **4th ASCAI Workshop in Orsay**
Orsay, France – 18 au 20 juin 2025
 - * Présentation projet [2]
- **Semaine du pôle MIPS Université de Montpellier –**
03/06/2025
 - * Présentation courte du projet [2]
- **Forty-Second International Conference on Machine Learning**
Vancouver, Canada – 13-19 juillet 2025
 - * Poster – **Publication** du papier sur projet [2]

Implication locale

- Encadrement d'un projet "**Apprentis Chercheurs**" 2024 – 10 séances de 3h – encadrement avec David Metivier d'un binôme collégien-lycéen
- Référent scientifique pour **Éloquensciences 2025** – échanges de mails – accompagnement et conseil à des collégiens/lycéens préparant un concours d'éloquence scientifique
- **Représentant des doctorants** en 2024/2025 – environ 10h – participation à certains conseils d'unité – coordination du séminaire mensuel des (post)-doctorant.e.s – organisation journée des doctorant.e.s
- **Présentation tutoriel** au semdoc de l'IMAG et au semdoc de MISTEA – introduction aux problèmes de bandits
- **Présentation semaine MIPS**– présentation du projet [2]

- Conférence StatMatAppli 2025
Fréjus, France – 1 au 5 septembre 2025
présentation projet [2]
- Rencontres de Statistique Mathématique
CIRM, France – 15 au 19 décembre 2025
- Journées de Statistique de la SFdS

- 8.10 - Édition scientifique, Open Access et Science ouverte : des clés pour publier
 - 20 mars 2024 - 26 mars 2024 (6 heures)
- 8.7 - MOOC Intégrité scientifique dans les métiers de la recherche
 - juin 2024 (15 heures)
- 4.6 - MOOC Rédiger et publier un article scientifique
 - juin 2024 (20 heures)
- Médiation scientifique dispositif apprentis chercheurs
 - 04 décembre 2023- juin 2024 (30 heures)
- réunion rentrée
 - nov 2023 (2 heures)

Total : 74 heures / 5 modules

- Publication et accès ouvert en mathématiques
 - 03 avril 2025 (2h)
- Premiers secours en santé mentale
 - 23/24 septembre 2024 (14 heures)
- MOOC Machine learning in Python with scikit-learn
 - 01 août 2024-20 août 2024 (30 heures)
- MOOC FORMENSUP Se former pour enseigner dans le supérieur
 - 07 janvier 2025-29 avril 2025 (24 heures)
- 4.1 Zotero
 - 01 octobre 2024-30 novembre 2024 (3 heures)

Total : 146 heures / 10 modules

MCE à l'Université de Montpellier

- 2023/2024 – 63.5h TD (pour le stage agrégation)
 - **Algèbre I** : TD en L1 maths (S1) – systèmes linéaires – 25.5h
 - **Analyse II**: TD en L1 maths (S2) – suites, séries, et DL – 30h
 - **Prépa Agrég** : M2 Maths agreg.– prépa. écrits et oraux– 8h
- 2024/2025 – 63 h TD (pour le stage agrégation)
 - **Mesure et intégration, Fourier**: TD en L3 maths (S1) – théorie de l'intégration selon Lebesgue, transformée de Fourier — 36 h
 - **Remédiation en mathématiques**: TD en L1 bio (S1) – proportionnalité, dilution, mathématiques pour la biologie — 27 h