

Journées de Probabilités 2021, Guidel, BZH

# Euclidean Random Assignment Problems: origin, state of the art and some open problems in one dimension

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Based on several papers in collaboration with

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## Section 1

## Background and Definition

## Section 2

## State of the art

## Section 3

## ERAPs at $d = 1$

## Section 4

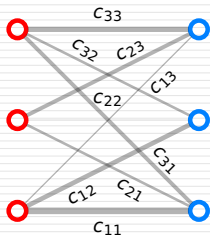
## Two open problems

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## The (linear sum) Assignment Problem (AP)

For a  $n \times n$  cost matrix  $c$ , find a bijection  $\pi$  (a permutation) s.t.  $E = \sum_i c_{i\pi(i)}$  is minimal. Let  $E_{\min}$  be the minimal value.

Example at  $n = 3$ :



$$c = \begin{pmatrix} 5 & 3.5 & 1 \\ 2 & 1.2 & 3 \\ 3 & 2 & 4 \end{pmatrix}$$

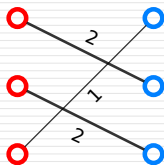
- Simple formulation  $\rightarrow$  good model in applications
- P-complete with  $\mathcal{O}(n^3)$  complexity [Munkres 1957]

## The (linear sum) Assignment Problem (AP)

For a  $n \times n$  cost matrix  $c$ , find a bijection  $\pi$  (a permutation) s.t.  $E = \sum_i c_{i\pi(i)}$  is minimal. Let  $E_{\min}$  be the minimal value.

Example at  $n = 3$ :

$$E_{\min} = 5$$



$$c = \begin{pmatrix} 5 & 3.5 & \textcircled{1} \\ \textcircled{2} & 1.2 & 3 \\ 3 & \textcircled{2} & 4 \end{pmatrix}$$

Swap columns (rows) s.t.  $\text{Tr}(c)$  is minimal [Koopmans–Beckmann 1957]; Optimal mixed strategy in a “hide and seek” game [Von Neumann 1953, 1954]

- Simple formulation  $\rightarrow$  good model in applications
- P-complete with  $\mathcal{O}(n^3)$  complexity [Munkres 1957]

# AP: an old problem



König  
1916



Egérvary  
1931

von Neumann  
1953

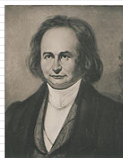


Kuhn  
1955



Canon simplicissimus.

	I	II	III	IV	V	VI	VII
I	25*	21	20	18	20	18	25
II	21	22*	21	21	13	21	22
III	16	19	23*	22	17	14	16
IV	21	12	18	27*	13	14	24
V	25	22	22	27	31*	16	31
VI	10	18	23	21	19	23*	21
VII	5	14	10	27	31	20	40*



*"De investigando  
ordine systematis  
aequationum ..."*

[Jacobi 1860]

See also [Ollivier  
2009]

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# The Random Assignment Problem I

$c$  is a random matrix ( $c_{ij}$  i.i.d. r.v.  $\sim \rho(l) = l^r + o(l^r)$ ).

$$\mathbb{E}[E_{\min}]_n \underset{n \rightarrow \infty}{\sim} c_r n^{1 - \frac{1}{r+1}}.$$

- Pioneered in Physics in the 80s by Mézard–Parisi and Orland
- Entered Probability mostly through Aldous in the 90s

Result: only “short” edges are relevant for large  $n$  and  $r$  can be considered a “universal exponent”.

Nice fact: at  $r = 0$  (i.e.  $\rho$  is e.g. uniform or  $\text{Exp}(\lambda)$  distribution)

$$c_0 = \zeta(2) = \frac{\pi^2}{6}.$$



## The Random Assignment Problem II

If  $c_{ij} \sim \text{Exp}(1)$ , Parisi conjectured (1998):

$$\mathbb{E}[E_{\min}]_n = \sum_{k=1}^n \frac{1}{k^2} = \frac{\pi^2}{6} - \frac{1}{n} + o\left(\frac{1}{n}\right)$$

- 1 Rectangular matrices [Coppersmith-Sorkin 1998]
- 2 Proof of  $\zeta(2)$  limit (among other things) [Aldous 2001]
- 3 Proof of Parisi conjecture [Prabhakar-Sharma 2001]
- 4 Extension to the  $k$ -partite case (NP-hard for  $k \geq 3$ )  
[Martin-Mézard-Rivoire 2004,2005]
- 5  $\exists!$  solution to “cavity” equation  
[Wästlund 2012, Larsson 2014, Salez 2015]

NOT discussed today...

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## The Euclidean Random Assignment Problem (ERAP)

Let  $\mathcal{B} = (B_1, \dots, B_n)$  be **blue** points and  $\mathcal{R} = (R_1, \dots, R_n)$  be **red** ones:  $n$ -samples of i.i.d. r.v. of pdf  $\rho_{\mathcal{B}(\mathcal{R})} : \Omega \rightarrow \mathbb{R}$  ("disorder"),  $(\Omega, \mathcal{D})$  is a metric space (mostly an **Euclidean** space with  $\mathcal{D}$  **Euclidean** distance). For  $p \in \mathbb{R}$  and an assignment (permutation)  $\pi$ , consider the *Hamiltonian*

$$\mathcal{H}(\pi) = \sum_{i=1}^n \mathcal{D}^p(B_i, R_{\pi(i)})$$

and the random variable (ground state energy)

$$\mathcal{H}_{\text{opt},(n,d)}^{(p)} = \min_{\pi \in \mathcal{S}_n} \mathcal{H}(\pi) \quad (\pi_{\text{opt}} = \arg \min_{\pi \in \mathcal{S}_n} \mathcal{H}(\pi)).$$

**Problem:** the rate of  $E_{p,d}(n) := \mathbb{E}[\mathcal{H}_{\text{opt},(n,d)}^{(p)}]$  as  $n \rightarrow \infty$ .

## Three motivations: Physics, Mathematics and Computer Science

- **Spin Glasses** - ERAP is a toy model of spin-glass (a **disordered** and **frustrated system**) in finite dimension, which is numerically simple in comparison to e.g. Edwards–Anderson spin glass [Mézard–Parisi 1988];
- **Optimal Transport** - ERAP is a Monge-Kantorovitch problem associated to empirical measures  $\rho_{\mathcal{B}}$ ,  $\rho_{\mathcal{R}}$ :

$$\mathcal{H}_{\text{opt}} = nW_p^p(\rho_{\mathcal{B}}, \rho_{\mathcal{R}})$$

where  $W_p$  is the  $p$ -**Wasserstein** distance [Villani 2009, Vershik 2013, Brezis 2018];

- **Computational Complexity Theory** - ERAP is a small (but crucial) modification of random TSP, however finding  $\pi_{\text{opt}}$  is **easy** (recall that AP is P-**complete**).

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## ERAP: the phase diagram

We shall put  $\rho_{\mathcal{B}} = \rho_{\mathcal{R}} := \rho$ . We wish to study

$$E_{p,d}(n) := \mathbb{E}[\mathcal{H}_{\text{opt},(n,d)}^{(p)}] \stackrel{?}{=} K_{p,d} n^{\gamma_{p,d}} (\ln n)^{\gamma'_{p,d}} (1 + o(1))$$

as  $n \rightarrow \infty$ , depending on  $(p, d)$  and the choice of  $\rho$ .

**Phase diagram:**  $(\gamma_{p,d}, \gamma'_{p,d})$  are expected to be “**universal**”, i.e. largely independent on the microscopic details (which may affect the constant  $K_{p,d}$ ).

**Remark:** non-uniform disorder is more subtle!

Example: standard Gaussian disorder at  $(p, d) = (2, 1)$

$$E_{2,1}(n) \sim 2 \ln \ln n \quad (\text{i.e. } \gamma_{2,1} = \gamma'_{2,1} = 0).$$

[Caracciolo–D’A–Sicuro 2019, Bobkov–Ledoux 2019, Berthet–Fort 2020]

See [Benedetto–Caglioti 2020] for non-uniform case at  $d = 2$ .

Section 2	State of the art
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2	State of the art



$$d \geq 3, p \geq 1$$

“Simple”:

$$E_{p,d}(n)|_{d \geq 3} \underset{n \rightarrow \infty}{\sim} c_{p,d} n^{\gamma_{\text{LB}}}$$

where

$$\gamma_{\text{LB}} := 1 - \frac{p}{d} = \gamma_{p,d} \quad [\text{Mézard–Parisi 1988}]$$

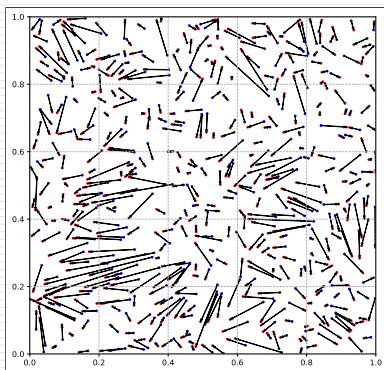
(if the disorder is uniform, otherwise unknown).

**Remark:** the constant  $c_{p,d}$  is **unknown** (upper and lower bounds in [Talagrand 1992]).

- Almost-sure limits of Euclidean functionals of finite random point sets [Barthe–Bordenave 2013 and refs. therein];
- Recurrent interest in Optimal Transport [Goldman–Trevisan 2020].

$d = 2$ : a challenge for both mathematicians and physicists

Example configuration for  $\Omega = [0, 1]^2$  and  $\mathcal{D}$  Euclidean distance:



Optimal assignment typically involves  $O(\ln n)$ -nearest-neighbors:  
 $(\gamma_{p,d}, \gamma'_{p,d}) = (\gamma_{LB}, \frac{p}{2})$  if  $p \geq 1$  [Ajtai-Komlós-Tusnády 1984]

## Recent developments in Mathematics and Physics

- 2014 Caracciolo–Lucibello–Parisi–Sicuro (Phys. Rev. E): using a (classical) field-theoretical approach, predicted

$$K_{2,2} = \frac{1}{2\pi};$$

- 2019 Ambrosio–Stra–Trevisan (PTRF): proof of  $K_{2,2} = \frac{1}{2\pi}$  (among other things) via PDE methods;
- 2020 Ambrosio–Glaudo (JEP): refinement on the remainder term (among other things);
- 2021 Benedetto–Caglioti–Caracciolo–**D'A**–Sicuro–Sportiello (JStatPhys): exact energy differences for ERAPs on two manifolds  $\Omega, \Omega'$ .

See [https://www.youtube.com/watch?v=4RcOiW20C\\_E](https://www.youtube.com/watch?v=4RcOiW20C_E) for a discussion of the latter results in the light of Weyl's law in spectral theory (and extension to ERAPs at  $d = 3$ ).

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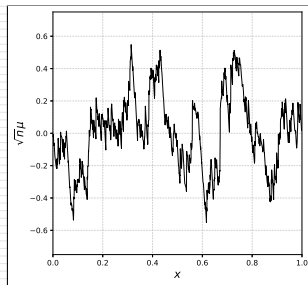
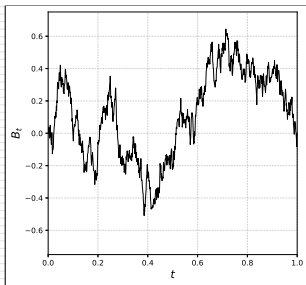




$p \geq 1$ ,  $\Omega = \mathbb{R}, [0, 1], \mathbb{R}^+$  and  $\mathcal{D} = ||$ : Brownian Bridge

Let the **transport field** be  $\mu_i := b_i - r_i$ . Then

$\sqrt{n}\mu_i \xrightarrow[\text{weakly}]{} B_t$ , the Brownian Bridge



Thus  $\mathcal{H}_{\text{opt},(n,p)} = \sum_i |\mu_i|^p$ , energy  $\sim$  moments of  $B_t$ .

[Boniolo–Caracciolo–Sportiello 2014, Caracciolo–Sicuro 2014, Caracciolo–**D’A**–Sicuro 2017)]





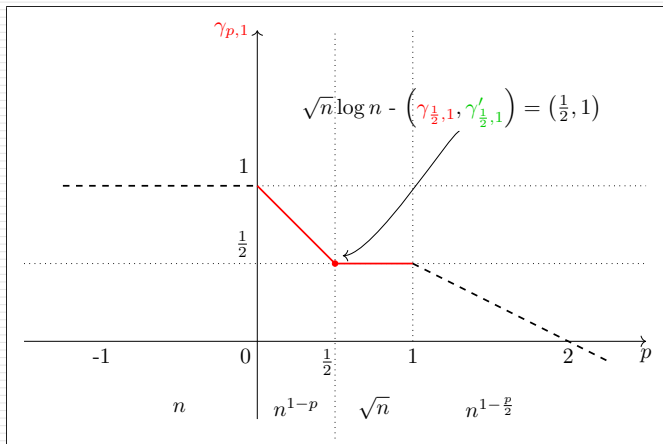








## Section of the Phase Diagram at $d = 1$



Product formula for number of solutions at  $d = p = 1$  [Caracciolo–Erba–Sportiello 2021].







## “Reduction to quadratures” in the bulk scaling

Let  $R$  be the cdf of  $\rho$ . Set  $\psi^{(\rho)} := \rho \circ R^{-1}$ . Then

$$E_{p,1}^{(\rho)}(n) = \frac{2^p}{\sqrt{\pi}} \Gamma\left(\frac{p+1}{2}\right) \int_0^1 \left[ \frac{\sqrt{s(1-s)}}{\Psi^{(\rho)}(s)} \right]^p ds \, n^{1-\rho/2} + o(n^{1-\rho/2}).$$

Caracciolo–**D’A**–Sicuro (JStatPhys 2018): non-rigorous **regularization methods** inspired by cutoff regularization in QFT. Analogous problem “in the continuum” by Bobkov–Ledoux (AMS 2019).

Example:  $\rho(x) = e^{-x}$ ,  $\psi^{\text{exp}}(s) = 1 - s$ .

- Cutoff method:  $E_{p,1}^{\text{exp}}(n) = \frac{2^p}{\sqrt[p]{\pi}} \Gamma\left(\frac{p+1}{2}\right) \int_0^{1-c/n} \left(\frac{s}{1-s}\right)^{\frac{p}{2}} ds$ .  
At  $p = 2$ , we get  $E_2(n) = 2 \ln n - 2 \log c - 2 + o(1)$ ;

- Exact calculation: at  $p = 2$  (via Beta integrals):  

$$E_{2,1}^{\text{exp}}(n) = 2 \sum_{k=1}^n \frac{1}{k} = 2 \ln n + 2\gamma_E + o(1).$$

(by comparison  $c = e^{-\gamma_E - 1} = 0.20655\dots$ )

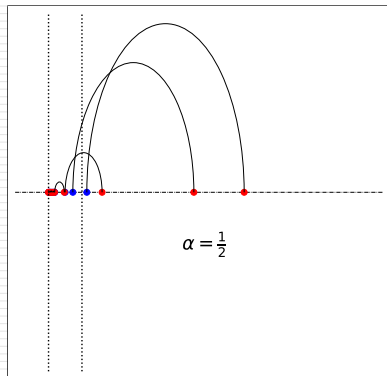
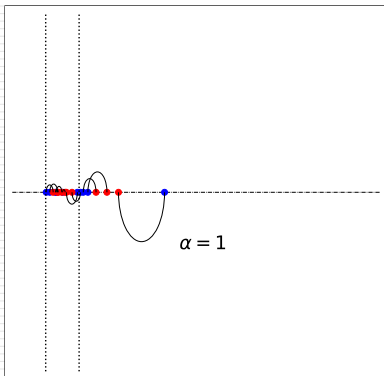


## Example: stretched exponential distribution

Let us consider the following pdf ( $\theta$  is Heaviside's function)

$$\rho_{ie,\alpha}(x) = \alpha x^{\alpha-1} \exp(-x^\alpha) \theta(x).$$

Example: solutions at  $n = 10$



$$\text{Thus } R_\alpha(x) = \exp(-x^\alpha)\theta(x) \implies R_\alpha^{-1}(u) = (-\ln u)^{\frac{1}{\alpha}}.$$

## Sketch of the computation

For integer  $s = \frac{1}{\alpha}$ , we wish to evaluate

$$M_{n,k;s} := \int_0^1 du P_{n,k}(u) (-\ln u)^s.$$

Lemma I (D'A-Sportiello 2020)

$$M_{n,k;s} = s! h_s(A_{k,n}),$$

for the alphabet  $A_{k,n} := \left\{ \frac{1}{k}, \frac{1}{k+1}, \dots, \frac{1}{n} \right\}$ , where  $h_s$  is the *complete homogeneous symmetric function* of degree  $s^*$ .

Two hints: 1) use the representation  $-\ln u = \lim_{x \rightarrow 0} \frac{u^{-x} - 1}{x}$  and 2) recall that for a polynomial  $A(q) = a_p q^p + a_{p-1} q^{p-1} + \dots + a_0$ ,

$$\sum_{q=0}^p \binom{p}{q} (-1)^{p-q} A(q) = p! a_p.$$

\*I.e. for alphabet  $(x_1, \dots, x_m)$ ,  $h_s(x_1, \dots, x_m) := \sum_{1 \leq j_1 \leq \dots \leq j_s \leq m} x_{j_1} x_{j_2} \cdots x_{j_s}$ .

## Sketch of the computation

The contribution  $E_{(s,p),n}(k)$  of the  $k$ -th edge in the solution to the total energy  $E_{(s,p)}(n) = \sum_{k=1}^n E_{(s,p),n}(k)$  is thus

$$\begin{aligned} E_{(s,p),n}(k) &= \sum_{q=0}^p \binom{p}{q} (-1)^{p-q} M_{n,k;s q} M_{n,k;s(p-q)} \\ &= \sum_{q=0}^p (-1)^q \binom{p}{q} (s q)! (s(p-q))! h_{s q}(A_{k,n}) h_{s(p-q)}(A_{k,n}). \end{aligned}$$

In the next step, we make use of **generating functions**.





















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## Open problem 1: the Dyck conjecture

**Proof** of the Dyck conjecture for  $p \in (0, 1)$ :

$$\lim_{n \rightarrow \infty} \frac{\mathbb{E}_n(\mathcal{H}_{\text{opt}})}{\mathbb{E}_n(\mathcal{H}_{\text{Dyck}})} = k_p.$$



## Open problem 2: implications of Generalised Selberg Integrals

Take only  $\Omega = [0, 1]$ ,  $\mathcal{D} = |\cdot|$  and  $\rho_{\mathcal{B}} = \rho_{\mathcal{R}} := \rho = \mathbb{1}_{[0,1]}(x)$ .  
From Generalised Selberg Integrals, we know [Caracciolo *et al.* 2019], for integer  $\ell$ ,

$$\mathbb{E}[|b_k - r_k|^\ell] = \frac{\Gamma^2(n+1)\Gamma(k + \frac{\ell}{2})\Gamma(n-k+1 + \frac{\ell}{2})\Gamma(1+\ell)}{\Gamma(k)\Gamma(n-k+1)\Gamma(n+1 + \frac{\ell}{2})\Gamma(n+1+\ell)\Gamma(1 + \frac{\ell}{2})}.$$

For the usual cost function  $f = |\cdot|^p$ , we have a nice formula for  $E(n)$ .

**Problem:** are there choices of a more general cost function  $f = f(|\cdot|)$  so that a “nice expression” for  $E(n)$  (i.e. not necessarily involving hypergeometric functions) can be obtained upon resummation?<sup>‡</sup>

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<sup>‡</sup>This question was raised by N.Enriquez during a talk given by the author at CIRM Marseilles - Luminy in March 2021.

Thank you for your attention!