# **Giorgio Parisi** a Modern Theoretical Physicist Complex Systems & Much More

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GDR Matériaux, Etats ElecTroniques, Interactions et Couplages non-Conventionnels

# **Giorgio Parisi**

### Some pics





### A renaissance man with so many interests

### **Theoretical physics & math**

Particle physics – Statistical physics – Dynamical systems & turbulence...

Numerical methods – Mathematics

### **Technical**

Computer architecture – Observation methods & data analysis

### the beyond\*

Neural nets, immunological system, optimisation, active matter, climate science...

Roman students' nickname of \***Mézard, Parisi & Virasoso,** *Spin glass theory and beyond* (World Scientific 1987)

### and a school of thought: a way of doing physics



### A renaissance man with so many interests

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it is not possible to cover all - let me tell you one story

# **Academic career**

### **Rome - USA - France - Rome**

Laurea at the Sapienza University of Rome (1970)

Researcher at the Laboratori Nazionali di Frascati (1971 - 1981)

Visiting scientist at Columbia University (1973 - 1974)

Visiting scientist at the Institut des Hautes Études Scientifiques (1976 - 1977) Visiting scientist at École Normale Supérieure (1977 - 1978)

Full professor at the University of Rome Tor Vergata (1981 - 1992)

Full professor at the Sapienza University of Rome (1992 - )

Member of the Accademia Nazionale dei Lincei since 2009

# Rome

### **Central to modern physics since at least the 30s**

### I ragazzi di via Panisperna



1930, circa

Photo on the left from wikipedia

Ragazzi di Via Panisperna In questa strada al civico 89, negli anni 30 i ricercatori D'Agostino, Fermi (Nobel 1938), Amaldi, Majorana, Rasetti, Pontecorvo, Segrè (Nobel 1959) accedevano all'istituto di Fisica, dove insieme aprirono l'era nucleare al mondo.

The Boys of Via Panisperna The entrance in this street at number 89, was used in the 1930s by researchers D'Agostino, Fermi (Nobel 1938), Amaldi, Majorana, Rasetti, Pontecorvo and Segrè (Nobel 1959) to reach the Institute of Phisics, where together they opened the world up to the nuclear age.

Photo on the right, it's mine

D'Agostino, Segrè, Amaldi, Rasetti & Fermi

# Rome

### Late 60s - both cond-mat & particle physics



#### Giovanni Gallavotti Giovanni Jona-Lasinio Carlo Di Castro



Nicola Cabibbo

Luciano Maiani

Guido Altarelli

# **Research debuts**

### The early 70's: a great period for Theoretical Physics in Rome

Giorgio in Nicola Cabibbo's Theory Group

Quantum Field Theory (as opposed to S-Matrix) for particle physics

First papers\*

- 5. Hadron Production in e+e- Collisions, with N. Cabibbo and M. Testa, Lettere al Nuovo Cimento 4 (1970) 35.
- 6. Deep Inelastic Scattering and the Nature of Partons, with N. Cabibbo, M. Testa and A. Verganelakis, Lettere al Nuovo Cimento 4 (1970) 569.
- 7. Gauge Invariance and Dynamical Symmetry Breaking, with M. Testa, Lettere al Nuovo Cimento 4 (1970) 71.
- 8. Generating Functionals, Ward Identities and Scalar Mesons, with M. Testa, Nuovo Cimento A67 (1970) 13.
- 9. Calculation of Critical Indices, with L. Peliti, Lettere al Nuovo Cimento 2 (1971) 627.
- 10. The s-Term and the Scale Breaking, with M. Testa, Lettere al Nuovo Cimento 2 (1971) 1154.

\* from Giorgio's webpage https://chimera.roma1.infn.it/GIORGIO/papers.html

# Nicola Cabibbo

### Giorgio's supervisor laurea degree 1970

Blitz quotidiano > Scienza > Giorgio Parisi "vendica" il suo prof Nicola Cabibbo: "Il Nobel per la Fisica doveva vincerlo anche lui"

## Giorgio Parisi "vendica" il suo prof Nicola Cabibbo: "Il Nobel per la Fisica doveva vincerlo anche lui"



Photo from Emilio Segrè's Visual Archives, Niels Bohr Library & Archives

# **Research debuts**

### ... Statistical Physics was already meddling in

Giorgio in Nicola Cabibbo's Theory Group

Quantum Field Theory (as opposed to S-Matrix) for particle physics

First papers\*

- 5. Hadron Production in e+e- Collisions, with N. Cabibbo and M. Testa, Lettere al Nuovo Cimento 4 (1970) 35.
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Full professor at the Sapienza University of Rome (1992 - )

Member of the Accademia Nazionale dei Lincei since 2009

# **Particle Physics**

### in Paris



Nuclear Physics B Volume 126, Issue 2, 8 August 1977, Pages 298-318



#### Asymptotic freedom in parton language G. Altarelli \* Laboratoire de Physique Théorique de l'Ecole Normale Supérieure, Paris, France G. Parisi \*\*\*

Institut des Hautes Etudes Scientifiques, Bures-sur-Yvette, France

Received 12 April 1977, Available online 26 October 2002.

Dokshitzer-Gribov-Lipatov-Altarelli-Parisi evolution equations describe the variation of the parton distribution functions with varying energy scales

Parton: Pre-QCD name for hadron (protons, neutrons) constituents (quarks, gluons)

# **Particle Physics**

### the Altarelli-Parisi paper



Altarelli

Yuri

EPS High Energy and Particle Physics Prize "for having developed the scheme" of a probabilistic field theory for the dynamics of quarks and gluons, enabling a quantitative understanding of high-energy collisions between hadrons"

"... Guido liked to remark that it is the most cited French paper in the field of high energy physics."

# **Random matrices**

### Planar diagrams - 1978

Commun. math. Phys. 59, 35-51 (1978)

Communications in Mathematical Physics © by Springer-Verlag 1978

#### **Planar Diagrams**

E. Brézin, C. Itzykson, G. Parisi\*, and J. B. Zuber

Service de Physique Théorique, Centre d'Études Nucléaires de Saclay, F-91190 Gif-sur-Yvette, France

Abstract. We investigate the planar approximation to field theory through the limit of a large internal symmetry group. This yields an alternative and powerful method to count planar diagrams. Results are presented for cubic and quartic vertices, some of which appear to be new. Quantum mechanics treated in this approximation is shown to be equivalent to a free Fermi gas system.

Exploiting 't Hoft's ideas to constrain the types of Feynman diagrams in gauge field theories & matrix models, *e.g.* 

$$\mathcal{L} = \mathrm{Tr}(\partial_{\mu}M\partial_{\mu}M^{\dagger}) + \mathrm{Tr}(MM^{\dagger}) + \frac{g}{2N}\mathrm{Tr}(MM^{\dagger}MM^{\dagger})$$

with  $M(ec{x})$  an N imes N matrix, in the large N limit & thus

count planar diagrams

# **Transition**

### $\textbf{Particle Physics}\mapsto \textbf{Statistical Physics}$

"At the beginning of the 80's I became mostly interested in problems in statistical mechanics and my only residual activity in high energy physics was lattice QCD"

> **G. Parisi**, *Historical and personal recollections of Guido Altarelli*, EPJ Web of Conferences 164, 02001 (2017)

### What are they? Dirty materials

*e.g.* a crystal with magnetic impurities placed at fixed random positions, a **spin-glass** 



Finite *d* Heisenberg

$$\mathcal{H}_J = -\sum_{ij} J_{ij}(\mathbf{R}) \ \mathbf{s}_i \cdot \mathbf{s}_j$$
  
Fully connected Ising SK

$$\mathcal{H}_J = -\sum_{i 
eq j} J_{ij} \; s_i s_j$$
 .

Exchanges chosen from a pdf

 $P(J_{ij})$  typically Gaussian

Sketch from Binder & Young, Rev. Mod. Phys. 58, 801 (1986)

### Self-averageness & the equilibrium Replica Method

Take a fully-connected spin  $\{s_i\}$ , i = 1, ..., N model with quenched random interactions  $J_{ij}$  drawn from a probability distribution  $P(J_{ij})$ 

$$\mathcal{H}_J[\{s_i\}] = -\sum_{i \neq j} J_{ij} s_i s_j$$

In the  $N 
ightarrow \infty$  limit, disorder averaged & typical free-energy densities, coincide

$$f_J \underset{N \to \infty}{=} [f_J] = -k_B T N^{-1} [\ln \mathcal{Z}_J]$$

self-averageness

- -

The disorder average can be evaluated with the help of the replica trick which

uses the identify  $x^n = \exp(n \ln x)$  Taylor expanded around n = 0

$$x^{n} \underset{n \to 0}{=} 1 + n \ln x + \mathcal{O}(n^{2}) \quad \Rightarrow \quad \left[ \ln \mathcal{Z}_{J} \right] \underset{n \to 0}{=} \frac{\left[ \mathcal{Z}_{J}^{n} \right] - 1}{n}$$

# **Replica method**

### A sketch

$$-\beta[f_J] = \lim_{N \to \infty} \frac{[\ln \mathcal{Z}_J]}{N} = \lim_{N \to \infty} \lim_{n \to 0} \frac{[\mathcal{Z}_J^n] - 1}{Nn}$$

 $\mathcal{Z}_J^n$  is the partition function of n independent copies of the system: the replicas

Gaussian  $P(J_{ij})$  average over disorder  $\Rightarrow$  replica coupling

$$\sum_{a} \sum_{i \neq j} J_{ij} s^a_i s^a_j \ \Rightarrow \ \sum_{i \neq j} \sum_{ab} s^a_i s^a_j s_i b s^b_j$$

Quadratic decoupling with the Hubbard-Stratonovich (Gaussian) trick

$$Q_{ab}\sum_{i}s_{i}^{a}s_{i}^{b}+\frac{1}{2}Q_{ab}^{2}$$

 $Q_{ab}$  is a  $0 \times 0$  matrix but it admits an interpretation in terms of **overlaps** The elements of  $Q_{ab}$  can evaluated by saddle-point if one exchanges the limits

 $\lim_{N \to \infty} \lim_{n \to 0} \dots \mapsto \lim_{n \to 0} \lim_{N \to \infty} \dots$ 

## The structure of the matrix $Q_{ab}$



Sherrington & Kirkpatrick, Solvable model of a spin-glass, PRL 35, 1792 (1975)

but S(T=0) < 0 and the saddle-point  $Q_{ab} = q$  is not stable

**de Almeida & Thouless**, *Stability of the Sherrington-Kirkpatrick solution of a spin glass model*, J. Phys. A : Math. Gen. **11**, 983 (1978)

Fig. from Morone, Caltagirone, Harrison & Parisi, Replica Theory and Spin Glasses, Les Houches 2013

#### Why? Answer: a nice open mathematical problem

VOLUME 43, NUMBER 23 PHYSICAL REVIEW LETTERS

3 December 1979

#### Infinite Number of Order Parameters for Spin-Glasses

G. Parisi

Servizio Documentazione, Istituto Nazionale di Fisica Nucleare, Laboratori Nazionali di Frascati, Frascati, Italy (Received 22 June 1979)

> This Letter shows that in the mean-field approximation spin-glasses must be described by an infinite number of order parameters in the framework of the replica theory.

J. Phys. A: Math. Gen. 13 (1980) L115-L121. Printed in Great Britain

#### LETTER TO THE EDITOR

#### A sequence of approximated solutions to the S-K model for spin glasses

#### G Parisi

Istituto Nazionale de Fisica Nucleare, Laboratori Nazionali di Frascati, Casella Postale 13, 0004 Frascati, Roma, Italy

Received 4 January 1980

Abstract. In the framework of the new version of the replica theory, we compute a sequence of approximated solutions to the Sherrington-Kirkpatrick model of spin glasses.

## The structure of the matrix $Q_{ab}$



Fig. from Morone, Caltagirone, Harrison & Parisi, Replica Theory and Spin Glasses, Les Houches 2013

The disorder averaged overlap distribution function P(q)

The elements of the matrix  $Q_{ab}$  are overlaps between equilibrium states

$$Q_{ab} = \frac{1}{N} \sum_{i=1}^{N} s_i^a s_i^b$$

and are distributed according to  $P_J(q=Q_{ab})$ 

Parisi's 79-82 a way to calculate  $P(q) = [P_J(q)] \Rightarrow [f_J]$ 



The predicted equilibrium free-energy density  $[f_J]$  was confirmed by **Guerra & Talagrand 00-04** with independent mathematical-physics methods

## How to measure $P_J(q)$ ? Overlaps between real replicas

Take one sample and run it, with e.g. Monte Carlo, until it reaches equilibrium, measure the spin configuration  $\{s_i\}$ .

Re-initialize the same sample (same  $J_{ij}$ ), run it again until it reaches again equilibrium, & measure the spin configuration  $\{\sigma_i\}$ .

Construct the overlap  $q_{s\sigma} \equiv N^{-1} \sum_{i=1}^{N} s_i \sigma_i$ .

In a PM system the overlap will typically vanish as, say,  $N^{-1/2}$ 



Many repetitions for a system with  $N\gg 1$ 

$$P(q_{s\sigma}) = \delta(q_{s\sigma})$$

## How to measure $P_J(q)$ ? Overlaps between real replicas

Take one sample and run it, with e.g. Monte Carlo, until it reaches equilibrium, measure the spin configuration  $\{s_i\}$ .

Re-initialize the same sample (same  $J_{ij}$ ), run it again until it reaches again equilibrium, & measure the spin configuration  $\{\sigma_i\}$ .

Construct the overlap  $q_{s\sigma} \equiv N^{-1} \sum_{i=1}^{N} s_i \sigma_i$ .

In a FM system there are four possibilities



How to measure  $P_J(q)$ ? Overlap between real replicas

**SK model** with N = 4096 at  $T = 0.4 T_c$  and six  $J_{ij}$ , one per panel



Aspelmeier, Billoire, Marinari & Moore, Finite size corrections in the Sherrington-Kirkpatrick model, J. Phys. A 41, 324008 (2008)

# **Real replicas**

How to measure  $P_J(q)$ ? Overlap between real replicas

**SK model** with N = 4096 at  $T = 0.4 T_c$  and six  $J_{ij}$ , one per panel



Data in each panel for a different realization of the random couplings

Most samples have peaks at  $|q| < q_{\rm EA}$ : replicas  $\{s_i\}$  and  $\{\sigma_i\}$  falling in different states

### **Thouless-Anderson-Palmer**

**SK model** 

$$\mathcal{H}_J = -\sum_{i \neq j} J_{ij} s_i s_j$$

(Naive) free-energy function of the local order parameters  $m_i=\langle s_i 
angle$ 

$$Nf_J(\{m_i\}) = -\sum_{i \neq j} J_{ij} m_i m_j + k_B T \sum_{i=1}^N \frac{1+m_i}{2} \ln \frac{1+m_i}{2} + \frac{1-m_i}{2} \ln \frac{1-m_i}{2}$$

and the (naive) TAP equations

$$m_i = \tanh \sum_{j(\neq i)} 2\beta J_{ij} m_j$$

that determine the  $m_i$  at the saddle-point level

**Thouless, Anderson, Palmer**, *Solution of 'Solvable model of a spin glass'*, Phil. Mag. 35, 593 (1977). **De Dominicis & Young**, *Weighted averages and order parameters for the infinite range Ising spin glass*, J. Phys. A : Math. Gen. 16, 2063 (1983)

### Many solutions: complex landscapes



Fig. from C. Cammarota

## Much more Opened so many areas of research

and more or less simultaneously!

# **Stochastic resonance**

#### **Stochastic processes & climate science - 1981**

Tellus (1982) 34, 10-16

#### Stochastic resonance in climatic change

By ROBERTO BENZI, Istituto di Fisica dell'Atmosfera, C.N.R., Piazza Luigi Sturzo 31, 00144, Roma, Italy, GIORGIO PARISI, I.N.F.N., Laboratori Nazionali di Frascati, Frascati, Roma, Italy, ALFONSO SUTERA, The Center for the Environment and Man, Hartford, Connecticut 06120, U.S.A.

and ANGELO VULPIANI, Istituto di Fisica "G. Marconi", Università di Roma, Italy

(Manuscript received November 12, 1980; in final form March 13, 1981)

#### ABSTRACT

An amplification of random perturbations by the interaction of non-linearities internal to the climatic system with external, orbital forcing is found. This stochastic resonance is investigated in a highly simplified, zero-dimensional climate model. It is conceivable that this new type of resonance might play a role in explaining the 10<sup>3</sup> year peak in the power spectra of paleoclimatic records.

 $[T(t)(a - T^{2}(t))] + \underbrace{A\cos\Omega t}_{t}$ periodic non-linear white noise

# **Kardar-Parisi-Zhang**

### Surface growth - 1986



Kardar, Parisi & Zhang, Dynamic Scaling of Growing Interfaces, PRL 56, 889 (1986)



#### (a) Proliferating cancer cells.

**Mathematics** 

Experiments Takeuchi, Physica A 504, 77 (2018)

M. Hairer, Fields Medal 2014

**IUPAP Young Scientist Award 2013** 

# Array processor with emulator

#### **APE:** a computer for lattice QCD - since 1984



APE images & photos courtesy of Gaetano Salina

# Array processor with emulator

### **APE:** a computer for lattice QCD - since 1984

![](_page_32_Picture_2.jpeg)

![](_page_32_Picture_3.jpeg)

Enzo Marinari - Gaetano Salina - Nicola Cabibbo

Giorgio Parisi - G. Salina

APE images & photos courtesy of Gaetano Salina

More later on computer design: SUE-Janus collaboration for spin-glasses

### Late 80s - early 90s in Rome

![](_page_33_Picture_2.jpeg)

Daniel AmitMiguel VirasoroGiorgio ParisiNeural NetsDisordered SystemsRoma IRoma II

1991 - 1994

![](_page_34_Picture_2.jpeg)

### Out of equilibrium dynamics of spin glasses & glasses

$$\mathcal{H}_J[\{s_i\}] = -\sum_{i_1 \neq \dots \neq i_p} J_{i_1 \dots i_p} s_{i_1} \dots s_{i_p} \qquad p\text{-psi}$$

p-psin spherical model

random coupling exchanges drawn from  $P[J_{i_1...i_p}]$ Langevin dynamics (coupling to a bath)  $\gamma \frac{ds_i}{dt} = -\frac{\delta \mathcal{H}}{\delta s_i} + \xi_i$ 

![](_page_35_Figure_5.jpeg)

#### Analytic solution vs.

Experiments @ Uppsala, Saclay, UCLA out of equilibrium relaxation Aging effects & violations of FDT

LFC & Kurchan, Analytic Solution of the Off-Equilibrium Dynamics of a Long-Range Spin-Glass Model, PRL 71, 173 (1993)

### La Sapienza

![](_page_36_Picture_2.jpeg)

### Laurea at Tor Vergata (after PhD)

![](_page_37_Picture_2.jpeg)

### Benzi & Parisi

J. Phys. I France 4 (1994) 1641-1656

NOVEMBER 1994, PAGE 1641

#### Off equilibrium dynamics and aging in unfrustrated systems

L. F. Cughandolo, J. Kurchan and G. Parisi

Dipartimento di Fisica, Università di Roma I, *La Sapienza*, I-00185 Roma, Italy INFN Sezione di Roma I, Roma, Italy

(Received 21 June 1994, accepted 18 July 1994)

Abstract. — We analyse the Langevin dynamics of the random walk, the scalar field, the X-Y model and the spinoidal decomposition. We study the deviations from the equilibrium dynamics theorems (FDT and homogeneity), the asymptotic behaviour of the systems and the aging phenomena. We compare the results with the dynamical behaviour of (random) spin-glass mean-field models.

e.g. 
$$\mathcal{H} = \int d^d x \left[ \frac{1}{2} (\nabla \phi)^2 + \frac{r}{2} \phi^2 \right]$$
  
with  $\gamma \frac{\partial \phi}{\partial t} = -\frac{\delta \mathcal{H}}{\delta \phi} + \xi$ 

Photo on the left Rosa Zaldivia (mamma)

# The beyond

![](_page_38_Picture_1.jpeg)

MING MEZARD Giorgio PARIST Misual Annal VIRASORO World Scientific Lecture Notes in Physics - Vol. 9.

### SPIN GLASS THEORY AND BEYOND

An Introduction to the Replica Method and Its Applications

> **G** Parisi **M** Virasoro

M Mezard

World Scientific

World Scientific

# **Attractor Neural Networks**

### **Hopfield models**

$$H = \sum_{i \neq j} J_{ij} s_i s_j$$
 (Hopfield 1982) with  $J_{ij} = \frac{1}{M} \sum_{\mu=1}^{M} \xi_i^{(\mu)} \xi_j^{(\mu)}$  (Hebb 1949)  
 $N$  neurons  $s_i$  and  $M$  patterns  $\xi_i^{(\mu)}$  learnt

![](_page_39_Figure_3.jpeg)

Replica Method used to find the maximal (storage) capacity  $\alpha = M/N$  of such neural networks Amit, Gutfreund & Sompolinsky, PRL 55, 1530 (1985)

![](_page_40_Picture_0.jpeg)

42 Physics World September 1993

times, uneasy. During this

century many physicists

have moved to work in biology. Amongst the

most famous are Francis 

Physics began with the study of simple models that became more complicated as they became more realistic. Biology has followed the opposite path but the two disciplines are now converging in the study of complex systems

### **Statistical physics** and biology The relationship between biology and physics has often been close and, at

**GIORGIO PARISI** 

have a satisfactory formulation of the laws.

However, a knowledge of the laws that govern the behaviour of the constituent elements of the system does not necessarily imply an understanding of the

Parisi, Physics World 1993

# **Optimization problems**

### **Constrained satisfaction problems**

Problems involving variables which must satisfy some constraints

e.g. equalities, inequalities or both

studied in computer science to

compute their complexity or develop algorithms to most efficiently solve them

Typically, N variables, which have to satisfy M constraints.

e.g. the variables could be the weights of a neural network, and each constraint imposes that the network satisfies the correct input-output relation on one of M training examples (e.g. distinguishing images of cats from dogs).

Statistical physics approach

thermodynamic limit  $N 
ightarrow \infty$  and  $M 
ightarrow \infty$  with lpha = M/N finite

# **Optimization problems**

### **K-Satisfiability**

Hard to decide formulæ are made of M clauses involving k literals required to take the true value (x) or the false value  $(\overline{x})$  each, these taken from a pool of N variables. An example in k = 3-SAT is

$$F = \begin{cases} C_1 : x_1 \text{ OR } \overline{x}_2 \text{ OR } x_3 \\ C_2 : \overline{x}_5 \text{ OR } \overline{x}_7 \text{ OR } x_9 \\ C_3 : x_1 \text{ OR } \overline{x}_4 \text{ OR } x_7 \\ C_4 : x_2 \text{ OR } \overline{x}_5 \text{ OR } x_8 \end{cases}$$

All clauses have to be satisfied simultaneously so the formula has to be read

### ${\sf F}:C_1 \; {\sf AND} \; C_2 \; {\sf AND} \; C_3 \; {\sf AND} \; C_4$

When  $\alpha \equiv M/N \gg 1$  the problems typically become unsolvable while many solutions exist for  $\alpha \ll 1$ . A sharp **threshold** at  $\alpha_c$  for  $N, M \to \infty$ 

# **Random optisation problems**

### e.g., Random K-sat

Optimisation problems,

e.g. random K-SAT

Formula =  $\wedge_{k=1}^{M} C_k(\{B_i\})$ 

Boolean  $B_i=1,0$  with  $i=1,\ldots,N$ 

### Spin-glass on a random graph

Complex (free)energy - cost function landscape

![](_page_43_Figure_8.jpeg)

Disordered systems techniques (replicas, cavity methods) characterise these landscapes in great detail  $\Rightarrow$  guidelines to develop

smart algorithms to solve F (find minimum) in hard phases (M/N control)

Mézard, Parisi & Zecchina, Analytic and Algorithmic Solution of Random Satisfiability Problems, Science 297, 812 (2002)

**Onsager prize APS 2016** 

# **Animal behaviour**

### **Collective motion of starlings**

![](_page_44_Picture_2.jpeg)

# **Animal behaviour**

### **Observation and data collection in Rome**

**Reconstruction of the** 3d **positions** of individual birds in airborne flocks of a few thousand members

### **Opened the way to unprecedented data analysis**

e.g., proof that the interaction depends on the topological distance

Six-to-seven neighbour range

Importance for **cohesive reaction** against predators

Ballerini, Cabibbo, Candelier, Cavagna, Cisbani, Giardina, Lecomte, Orlandi, Parisi, Procaccini, Viale & Zdravkovic, Interaction ruling animal collective behavior depends on topological rather than metric distance: Evidence from a field study, PNAS 105, 1232 (2008)

# The SUE & Janus collaborations

### **Special Purpose Computers for spin glass simulations - 2000**

#### Roma - Ferrara (Italia) Badajoz - Madrid - Zaragoza (España)

#### **Discrete spins** & couplings

 $\begin{array}{l}({\rm Fe}_{0.5}{\rm Mn}_{0.5}{\rm TiO}_3)\\ {\rm Field\ Programmable\ Gate\ Arrays}\\ \sim 5\times 10^5\ {\rm PCs}\end{array}$ 

#### **Monte Carlo Simulations**

3d Edwards-Anderson Model Equilibration of  $\sim 10^3 - 10^4$  samples L = 32 down to  $T \sim 0.65 T_c$ Out of equilibrium  $\sim 10^2$  samples  $L = 80, \ 10^{12} \text{ MCs} \sim 1s$ time-scales comparable to experimental ones

![](_page_46_Picture_7.jpeg)

# The SUE & Janus collaborations

### **Three dimensional Edwards-Anderson model**

![](_page_47_Figure_2.jpeg)

**Álvarez Baños** *et al*, *Nature of the spin-glass phase at experimental length scales* J. Stat. Mech. P06026 (2010)

# & so much more

### just in Statistical Physics

Stochastic Quantisation (with Y-S Wu)

Langevin equations & Supersymmetric Quantum Mechanics (with **N Sourlas**)

Multifractality (with R Benzi, G Paladin & A Vulpiani)

Random matrices for glasses (with LFC, J Kurchan & F Ritort)

Effective potential for random first order phase transitions (with **S Franz**)

Large d theory for glasses (with J Kurchan, P-F Urbani, F Zamponi)

etc

# The school

### Map of co-authors $\sim$ 300

![](_page_49_Picture_2.jpeg)

# The school

### Map of co-authors

![](_page_50_Picture_2.jpeg)

# **Responsabilities**

### Lecturer & scientific advisor\* at Les Houches

![](_page_51_Picture_2.jpeg)

#### **NOBEL LAUREATE GIORGIO PARISI**

Oct. 2021

Congratulations to Giorgio Parisi, the 2021 Physics Nobel Laureate who was a member of the board of Ecole de Physique and was in les Houches in 2013, 2020 and will be one of the speakers in May 2022 for the celebration of the 71th anniversary of the School of Physics.

From the Les Houches School website

\*All my gratitude

![](_page_52_Picture_0.jpeg)

![](_page_52_Picture_1.jpeg)

# 70th birthday

![](_page_53_Picture_1.jpeg)

Juan Ruiz-Lorenzo LFC GP Miguel Virasoro Daniel Stariolo