

*NETADIS Kick off meeting*

*Torino, 3-6 february 2013*

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# Outline

- My background
- Project:
  - 1) Theoretical part
    - a) Haus master equation and Hamiltonian
    - b) First steps:
      - Modelling systems with disordered couplings
      - with multi body interactions ( non- linear)
      - Cavity method
  - 2) Numerical part
    - GPU based Monte Carlo numerical simulation
- Courses

# My Background



--> Previous research experience:

Dr. Pranesh Sengupta, Materials Science Department,  
Bhabha Atomic Research Centre (BARC), Mumbai :

"Crystal-chemical comparative study between naturally occurring sphene crystal".

EPMA, TEM, Raman microscopy, UV-VIS spectrography

--> MS Physics, Banasthali University (july 2010-may 2012) .

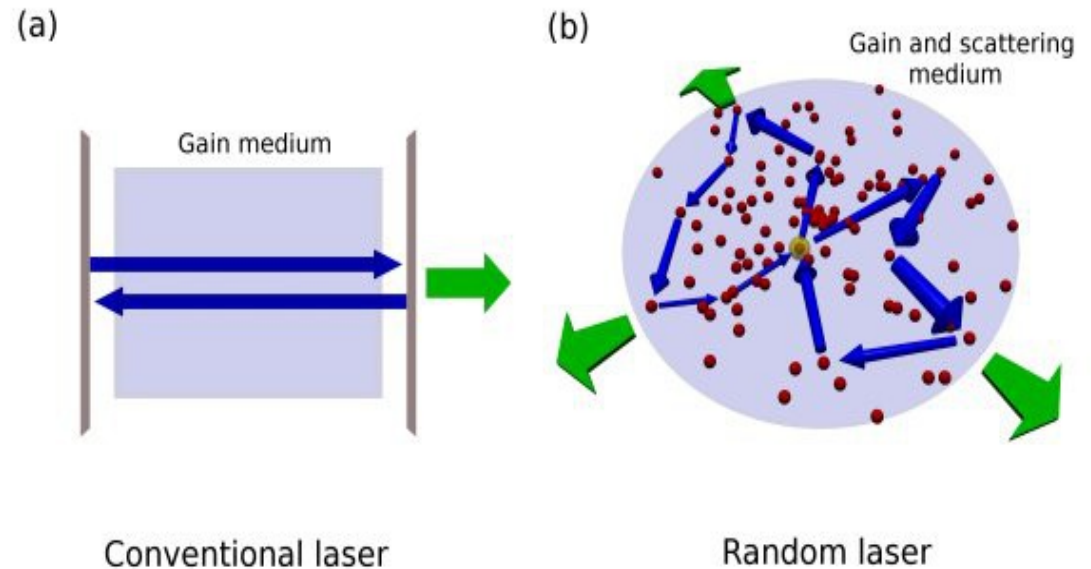
--> BS Physics, St. Stephen's College, University of Delhi (july 2007- may 2010) .

# Project

Supervisor : Dr. Luca Leuzzi

Aim : “Inference of coupling of waves in non linear disordered medium.”

- understanding random laser through disordered systems
- strong interaction in closed cavity
- random distribution of scatterers
- localization of em modes
- scattering -> degree of localization
- disorder induced random couplings
- non linearity couples the modes
- paramagnetic
- ferromagnetic
- complex glassy regimes
- statistical properties-> phase relations



C. Conti and L. Leuzzi “Complexity of waves in non linear disordered media”, Phys Rev B 83, 134204(2011)

D.S. Wiersma , Nat Phys 4, 359 (2008)

# Haus Master equation

Haus master equation for mode locking lasers in ordered cavities

$$T_R \frac{\partial a}{\partial t} = (g - l) a + \left( \frac{1}{\omega^2} + iD \right) \frac{\partial^2 a}{\partial \tau^2} + (\gamma - i\delta) |a|^2 a$$

Mode locking condition :

$$\omega_j + \omega_k - \omega_l - \omega_m = 0$$

Langevin dynamical equation :

$$\dot{a}(t) = \frac{-\partial H}{\partial a_n} + \eta_n(t)$$

$$\dot{a}(t) = (g_n - l_n + iD_n) a_n + (\gamma - i\delta) \sum_{\omega_j + \omega_k = \omega_l + \omega_m} a_j^* a_k a_l + \eta_n(t)$$

Hamiltonian :

$$H = -\Re \left[ \sum_{j < k} G_{jk}^{(2)} a_j a_k + \sum_{\omega_j + \omega_k = \omega_l + \omega_m} G_{jklm}^{(4)} a_j^* a_k^* a_l a_m \right]$$

Where,

$g_n$ : gain coefficient

$l_n$ : loss term

$D_n$ : group velocity of the wave packet

$\gamma$ : coefficient of saturable absorber

$\delta$ : coefficient of the Kerr lens

$\eta_n(t)$ : white noise

# Hamiltonian

Amplitude :  $\sum_i |a_i|^2 = \sum_i A_i^2 = E$  ,  $a = A e^{i\phi}$

Hamiltonian for closed cavity:

$$H = \sum_{\omega_j + \omega_k = \omega_l + \omega_m}^{1,N} G_{jklm} A_j A_k A_l A_m \cos(\phi_j + \phi_k - \phi_l - \phi_m)$$

$$H_J[\phi] = - \sum_{i_1 < i_2, i_3 < i_4}^{1,N} J_i \cos(\phi_{i_1} + \phi_{i_2} - \phi_{i_3} - \phi_{i_4})$$

Effective interaction among mode amplitudes is governed by:

$$G_{jklm} = 1/2 \sqrt{\omega_j \omega_k \omega_l \omega_m} \int_V d^3 r \chi_{\alpha\beta\gamma\delta}^{(3)}(\omega_j, \omega_k, \omega_l, \omega_m; \mathbf{r}) E_j^\alpha(\mathbf{r}) E_k^\beta(\mathbf{r}) E_l^\gamma(\mathbf{r}) E_m^\delta(\mathbf{r})$$

where ,

$G_{jklm}$  : Coefficient of spatial overlap of electromagnetic fields of the modes

$\chi^{(3)}$  : non linear susceptibility

# Theoretical part

**Bethe Lattice** we study two different mean field models of Bethe lattice and look into their mean field properties.

- **XY model**  
- angle variable is the phase of a mode.  
- mode phases are represented by continuous spins.  
- 4 body interaction, couplings from short to long range

$$H_J[\phi] = - \sum_{i_1 < i_2, i_3 < i_4}^{1, N} J_i \cos(\phi_{i_1} + \phi_{i_2} - \phi_{i_3} - \phi_{i_4})$$

$$\text{where, } i = \{i_1, i_2, i_3, i_4\}$$

- **Spherical spin model**

- fully connected
- Ising spins are replaced by real continuous variables  $\sigma_i$ , for  $p=4$
- spherical constraint to keep energy finite:  $\sum_i \sigma_i^2 = N$ , N-dim sphere of  $\sqrt{N}$  radius.

$$H = - \sum_{i_1 > \dots > i_p = 1}^N J_{i_1 \dots i_p} \sigma_{i_1 \dots i_p}$$

- **Continuous variable-XORSAT**

These are the optimization problems where we study a diluted  $p=4$  spin model ( both spherical and XY).

# First Steps

- **SK model**
- infinite range spin glass model
- fully connected
- Couplings  $J$  are random and non zero
- distribution of local fields is Gaussian

Replica Symmetric treatment:

$$\text{Hamiltonian: } H_J[s] = -\sum_{1 \leq i < k \leq N} J_{i,k} s_i s_k - \sum_i h s_i$$

$$\text{Free energy: } f_n = -\left(\frac{1}{\beta} nN\right) \ln Z_n$$

$$\text{Replicated partition function: } (Z_J)^n = \sum_{s^1} \sum_{s^2} \dots \sum_{s^n} \exp -\sum_{a=1}^n \beta H_J[s^a]$$

$$f = -\beta/4 (1-q)^2 - \int_{-\infty}^{\infty} dz / (2\pi)^{1/2} \exp(-z^2/2) \ln(2 \cosh(\beta q^{1/2} z + \beta h))$$

$$\text{Magnetisation: } m = \int_{-\infty}^{\infty} dz / (2\pi)^{1/2} \exp(-z^2/2) \tanh(\beta q^{1/2} z + \beta h)$$

$$\text{Order parameter: } q = \int_{-\infty}^{\infty} dz / (2\pi)^{1/2} \exp(-z^2/2) \tanh^2(\beta q^{1/2} z + \beta h)$$

$$\text{Entropy: } S(0) = -0.17$$



- Replica Symmetry Breaking solution
- Order parameter : probability distribution function  $P(q)$ :

$$P(q) = m \delta(q - q_0) + (1 - m) \delta(q - q_1)$$

$$q^k = \lim_{n \rightarrow 0} 1 / (n(n-1)) / 2 \sum_{\{a,b\}} [Q_{a,b}]^k$$

Matrix :

$$Q_{ab} = q_1 \quad \text{if} \quad I(a/m) = I(b/m)$$

$$Q_{ab} = q_0 \quad \text{if} \quad I(a/m) \neq I(b/m)$$

Free energy :  $f(q_0, q_1, m) = -\beta/4 [1 + mq_0^2 + (1 - m)q_1^2 - 2q_1] - \ln 2$   
 $-\int dp_{q_0}(z) m^{-1} \ln \left\{ \int dp_{(q_1 - q_0)}(y) \cosh^m[\beta(z + y + h)] \right\}$

$$q_1 = \int dp_{q_0}(z - h) \int dp_{q_1 - q_0}(y) \cosh^m[\beta(z + y)] \tanh^2(\beta(z + y)) / D(z)$$

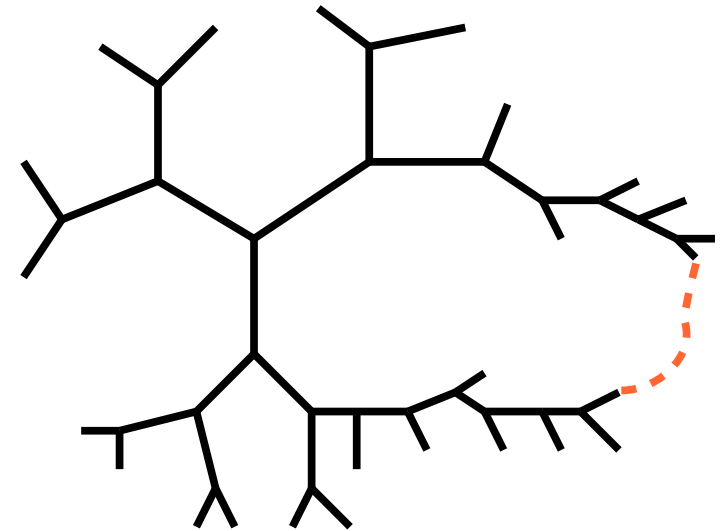
$$q_0 = \int dp_{q_0}(z - h) \left\{ \int dp_{q_1 - q_0}(y) \cosh^m[\beta(z + y)] \tanh(\beta(z + y)) / D(z) \right\}^2$$

# Bethe Lattice

- Finite dimensional model
- System of N Ising spins,  $\sigma_i = \pm 1, i \in \{1, N\}$

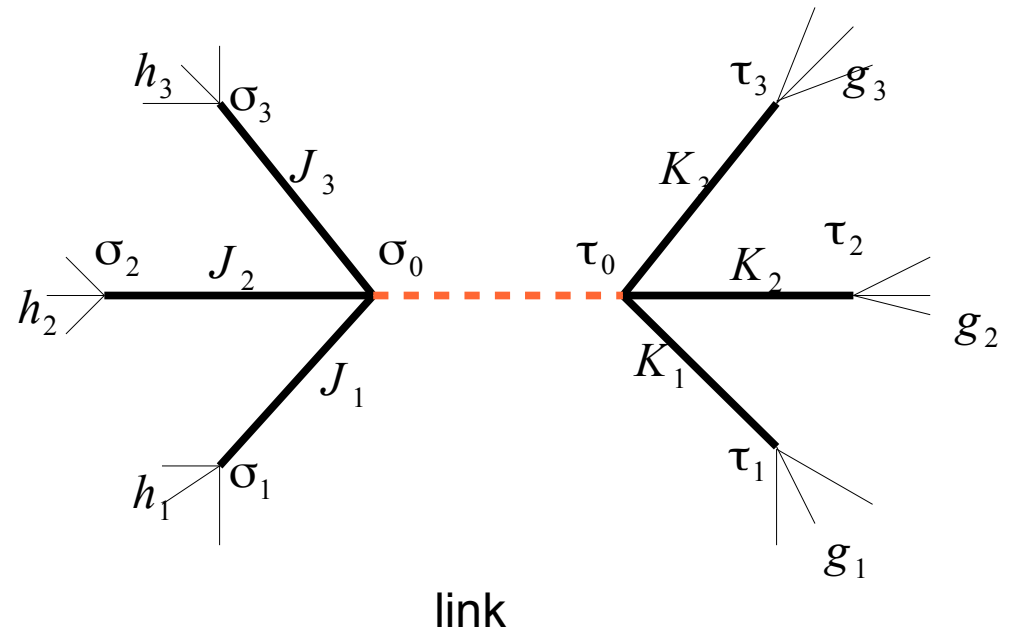
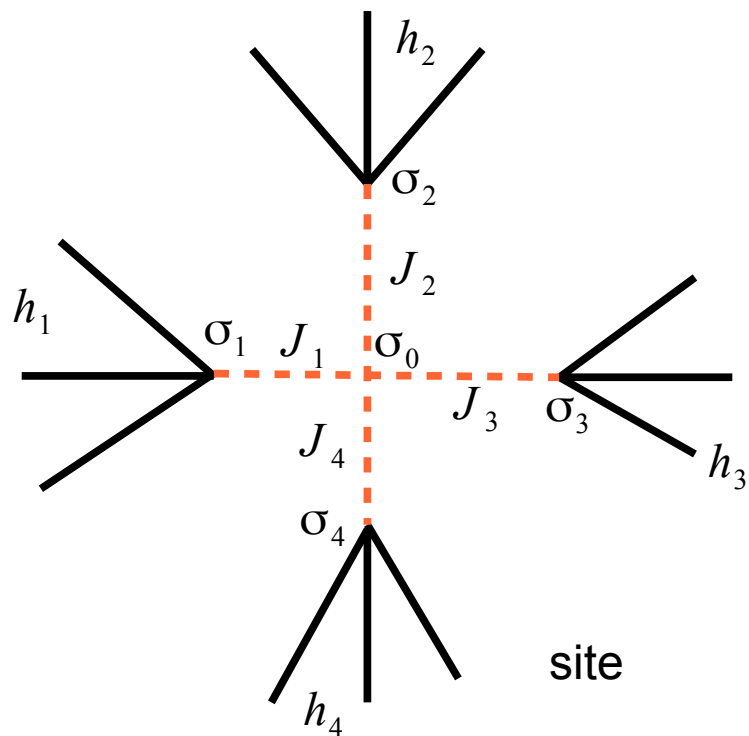
$$E = -\sum_{i,j} J_{i,j} \sigma_i \sigma_j$$

$J_{i,j}$  : independent random variable with probability distribution P(J)



- Cayley tree:
  - inhomogeneous
  - 1<sup>st</sup> shell :at  $i=0$ ,  $k+1$  neighbours  $\rightarrow$  2<sup>nd</sup> shell each spin connected to  $k$  new neighbours.....  $\rightarrow$  L'th shell (boundary).
- Random graph with fluctuating connectivity: Erdos Renyi graphs
  - link present :  $c/N$  and absent :  $1 - c/N$
  - where  $c$  : number of links connected to a point with Poisson distribution
- Bethe lattice :
  - Random graph with fixed connectivity  $k+1$
  - its a subset of Cayley tree containing only first few shells
  - statistically homogeneous
  - locally tree like, with fixed branching ratio
  - No small loops, size of loop  $\sim O(\log N)$

# Cavity Method

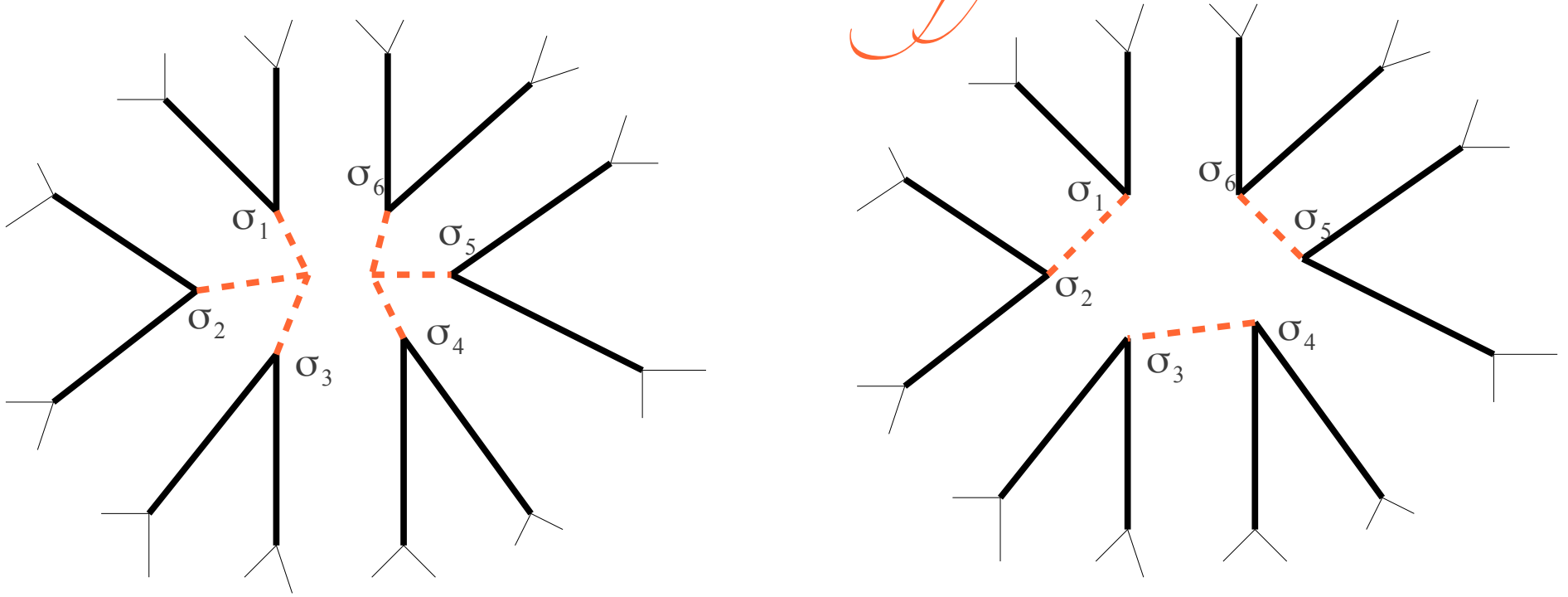


- mean field approach
- equivalent to Replica approach
- iterative method on tree like structures
- comparison of a  $N \rightarrow N+1$  spin system.
- adding a new spin at site 0.
- site and link contribution.
- reshuffling of spins.
- reweighing of configurational weights for contribution to new equilibrium state

# Cavity method equivalent to 1RSB

- Existence of several pure  $\alpha : 1 \rightarrow \infty$
- merge  $k$  sites to a site  $i=0$ ,  
 field at  $i=0 : h_0^\alpha$ , free energy iid exponential distribution :  $F^\alpha$   
 Initially various states have weights :  $W^\alpha = \frac{\exp(-\beta F^\alpha)}{\sum_y \exp(-\beta F^y)}$
- Field at  $i=0$  calculated as:  $h_0 = \sum_{i=1}^k u(J_i, h_i)$   $u(j, h) = 1/\beta \operatorname{atanh}(\tanh(\beta J) \tanh(\beta h))$
- states are ordered in increasing order of free energy and only lowest  $M$  states are considered.
- When we change the site  $i$ , the probability distribution of fields fluctuates and the new probability distribution  $Q(h)$  is to be calculated.
- $N$  local fields  $h_i$  of which  $k$  fields are chosen,  $i_1, \dots, i_k$  of  $1, \dots, N$   
 $h_i^\alpha$ , where  $i \in 1, \dots, N$ ,  $\alpha \in 1, \dots, M$

# Free Energy



$$F = \frac{k+1}{2} \Delta F^{(link)} - \Delta F^{(site)}$$

Site contribution:  $-\beta \Delta F^{(site)}(J_1 \dots J_{k+1}, h_1 \dots h_{k+1}) = \ln [2 \cosh(\beta \sum_{i=1}^{k+1} u(J_i, h_i))] + \sum_{i=1}^{k+1} \ln \left[ \frac{\cosh \beta J_i}{\cosh(\beta u(J_i, h_i))} \right]$

Link contribution:  $-\beta \Delta F^{(link)}(J_1 \dots J_k, K_1 \dots K_k, h_1 \dots h_k, g_1 \dots g_k) = \sum_{i=1}^k \ln \frac{\cosh(\beta J_i) \cosh(\beta K_i)}{\cosh(\beta u(J_i, h_i)) \cosh(\beta u(K_i, g_i))}$   
 $+ \ln(\sum_{\sigma_0, \tau_0} (\beta J_0 \sigma_0 \tau_0 + \beta \sigma_0 \sum_{i=1}^k u(J_i, h_i) + \beta \tau_0 \sum_{i=1}^k u(J_i, h_i) + \beta \tau_0 \sum_{i=1}^k u(K_i, g_i)))$

## Site contribution :

$$\text{Field: } h_0 = \sum_{j=1}^{k+1} u(J_j, h_j)$$

$$\text{Free energy: } F^{(1)} = \frac{-1}{\beta} x \ln(1/M \sum_{\alpha} \exp[-\beta x \Delta F^{\alpha}])$$

$$\text{Order parameter: } q_1 = \frac{1}{M} \sum_{\alpha} \tanh^2(\beta h^{\alpha})$$

$$\text{Order parameter: } q_0 = \frac{1}{M(M-1)} \sum_{\alpha \neq \gamma} \tanh(\beta h^{\alpha}) \tanh(\beta h^{\gamma})$$

$$x \text{ derivative: } d^{(1)} = \frac{1}{x} \frac{\sum_{\alpha} \exp(-\beta x \Delta F^{\alpha}) \Delta F^{\alpha}}{\sum_{\alpha} \exp(-\beta x \Delta F^{\alpha})}$$

## Link contribution:

$$\text{Fields: } h_0^{\alpha} = \sum_{i=1}^k u(J_i, h_i) , \quad g_0^{\alpha} = \sum_{i=1}^k u(k_i, g_i)$$

$$\text{Free energy: } F^{(2)} = \frac{-1}{\beta} x \ln(1/M \sum_{\alpha} \exp[-\beta x \Delta F^{\alpha}])$$

$$\text{Order parameter: } q_0^{(l)} = \frac{1}{M} \sum_{\alpha} \tanh^2(\beta v^{\alpha})$$

$$\text{Order parameter: } q_1^{(l)} = \frac{1}{M(M-1)} \sum_{\alpha \neq \gamma} \tanh(\beta v^{\alpha}) \tanh(\beta v^{\gamma})$$

$$x \text{ derivative: } d^{(2)} = \frac{1}{x} \frac{\sum_{\alpha} \exp(-\beta x \Delta F^{\alpha}) \Delta F^{\alpha}}{\sum_{\alpha} \exp(-\beta x \Delta F^{\alpha})}$$

# Numerical part

- finite dimensional model , finite number of modes in a given sample induced geometry.

=> simulations.

- Intensity spectra of random laser--> space and frequency correlations among amplitude and phases.
- Continuous variables --> Monte Carlo simulations --> GPU's
- Bethe lattice was mean field model --> modes distance independent.
- When distance taken into consideration --> computations are complex.
- Levy graph :

$$P_{ij} = \frac{1}{|\vec{i} - \vec{j}|^\rho}$$

$i - j$  : *distance between the sites*

$\rho \gg 1$  : *short range*

$\rho = 0$  : *Bethe lattice*

# *Further developments*

- As a further step--> apart from random lasers --> study interaction between radiative modes in photonics (linear interaction and disorder).
- Inverse problem --> four point correlation --> recover interaction between modes from experimental data --> correlations between modes.



Also, possibility of secondment  
in generalisation of inverse  
problem methods to continuous  
variables and 4- point  
correlation



Torino



# *Courses*

1) Coursework in Sapienza University (January- July) :

- **Structural glasses**

- **Spin glasses**

- **Random graphs**

- **Monte Carlo method**

2) Course on **GPGPU** and **CUDA** programming, CINECA Bologna (9-10 May).

3) 22nd summer school on **Parallel computing**, CINECA Bologna (20-31 May).

4) International summer school, fundamental problems in **Statistical Mechanics** XIII, Leuven, Belgium (16-29 June).

5) Advanced Workshop on **Nonlinear Photonics, Disorder and Wave Turbulence** ICTP, Trieste (15-19 July).

*Thank you*  
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