An explicit construction of Parisi landscapes in finite dimension

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### Disordered systems and landscapes

- Phenomenological description of glassy systems (glasses, proteins, spin-glasses): rugged energy landscapes
- Long (Goldstein 1969), useful but somewhat misleading tradition – coherence length scale implied
- Classification of random landscapes (lessons from Spin-Glasses)
  - SK model and Parisi's full-RSB: complex, hierarchical landcapes – valleys within valleys, ultrametricity
  - REM and 1-step RSB: random (golf course) landscape on the hypercube

### Disordered systems and landscapes

• More generally: models of random fields (turbulence, finance)

#### Extreme value statistics

- Low temperature physics of disordered systems: statistics of deep energies
- For  $M \gg 1$  Gaussian variables,  $\epsilon_{\max}(M) = \sigma \sqrt{2 \ln M} \left[ 1 + \frac{u}{2 \ln M} \right]$
- Extreme value distributions for IID
  - Exponential variables: Gumbel  $G(u) = \exp[-u \exp[-u]]$
  - Bounded variables: Weibull  $-H(u) = \mu u^{\mu-1} \exp[u^{\mu}], u > 0$
  - Power-law variables: Fréchet  $F(u) = \mu \exp[-u^{-\mu}]/u^{1+\mu}$

### Extreme value statistics

- The Random Energy Model:
  - $M = 2^N$ ,  $\sigma = \sqrt{N} \rightarrow \epsilon_{\max} \sim N$  and O(1) energy gap: non trivial thermodynamics
  - Gumbel statistics for low energy states equivalent to (1-Step) RSB and localisation
- Applications: Decaying Burgers' Turbulence with random initial conditions: picks up extremes of the initial field
- FRG for pinned manifolds; Shocks, Cusps and RSB [cf. Balents, JPB, Mézard; Le Doussal, Wiese]: bare disorder evolves with scales following a (functional) Burgers equation – shocks are associated to metastable state formation

# Random potential (finite dimension, short range)

• One particle in a short-range correlated Gaussian random potential  $V(\mathbf{r})$  in N dimensions:

$$V_{\sf max}(R)\sim\sigma\sqrt{\ln R^N}$$

- Not strong enough to compete with entropy:  $S \sim \ln R^N \rightarrow$  always in the high temperature (delocalized) phase
- Diffusive motion at any T, in any N:  $D \sim \exp(-\sigma^2/2NT^2)$
- But if the potential has exponential tails,  $V_{\text{max}} \sim \sigma N \ln R$ : true phase transition of the REM type at  $T_c = \sigma + \text{aging}$ dynamics below  $T_c$  (see e.g ([Ben Arous-Cerny])

# Random potential (finite dimension, long range)

 One particle in a long-range correlated Gaussian random potential V(r) in N dimensions:

 $\langle V(\mathbf{r})V(\mathbf{r}')\rangle = Ng^2 |\mathbf{r}-\mathbf{r}'|^{2H}, \quad (H>0) \quad \rightarrow V_{\max}(R) \sim \sqrt{NgR^H}$ 

- Always beats entropy  $S \sim \ln R^N \rightarrow$  always in the low temperature (localized) phase
- Example: Exactly soluble Sinai (random force) model in N = 1 dimension → logarithmic diffusion and Golosov dynamic localization ([Fisher-Le Doussal-Monthus])

## Random potential (infinite dimension)

• One particle in a Gaussian random potential  $V(\mathbf{r})$  in  $N \to \infty$  dimensions:

$$\langle V(\mathbf{r})V(\mathbf{r'})\rangle = Ng^2 F[\frac{|\mathbf{r}-\mathbf{r'}|^2}{2N}],$$

- Short range:  $V_{\max}(R) \sim \sqrt{N}g\sqrt{2 \ln R^N} \sim Ng\sqrt{2 \ln R}$  can compete with  $S \sim N \ln R$  at fixed R but  $N \to \infty \to$  true phase transition
- Exactly soluble model in the large N limit using replicas ([Mézard-Parisi, Fyodorov-Sommers])

# Random potential (infinite dimensions)

- Short range (H < 0): 1 step RSB but  $T_c(R) \rightarrow 0$  for large R
- Long range (H > 0): full RSB but  $T_c(R) \to \infty$  for large R
- Special case, logarithmically growing F: 1-RSB with marginally stable modes for all  $T < T_c = g$  (remains finite at large R)

# Random potential (log case)

• A logarithmically correlated random potential in N dimensions:

$$\langle V(\mathbf{r})V(\mathbf{r}')\rangle = N\left[f_0 - g^2 \ln(|\mathbf{r} - \mathbf{r}'|^2 + a^2)\right]$$

- Simple argument:  $V_{\max} \sim g\sqrt{N \ln R} \sqrt{\ln R^N} \sim Ng \ln R$  matches S at  $T_c = g$
- Free energy given by a REM-like expression with a freezing transition at  $T_c = g$  indep of N, using RG methods ([Carpentier-Le Doussal]) – matches exact results at  $N = \infty$ ([Fyodorov-Sommers])
- Low-energy states still have a Gumbel-like distribution (with pre-exponential corrections)

#### Random potential (log case)

- Interesting dynamics:  $r^2(t) \sim t^{2/z}$  with a g dependent exponent  $z = 2 + 2(g/T)^2$ , and a dynamical transition at  $T_c$ , where z becomes 4g/T ([Castillo-Le Doussal]) and aging sets in
- Building block of the Bacry-Muzy-Delour multifractal random walk (finance):

$$dX(t) = \sigma(t)dW(t)$$
  $\sigma(t) = \sigma_0 \exp[-\beta V(t)]$  V Gaussian

$$\langle (X_t - X_{t+\tau})^n \rangle = M_n \tau^{\zeta_n} \quad \text{with} \quad \zeta_n = \frac{n}{2} - (\beta g)^2 \frac{n(n-2)}{2},$$

• Logarithmically correlated random potential with several scales:  $V(\mathbf{r}) = \sum_{i=1}^{K} V_i(\mathbf{r})$  with

$$\left\langle V_i\left(\mathbf{r}_1\right) V_j\left(\mathbf{r}_2\right) \right\rangle_V = \delta_{i,j} N F_i\left(\frac{1}{2N}(\mathbf{r}_1 - \mathbf{r}_2)^2\right), \quad f_i(u) = -g_i^2 \ln\left(u + R^{2\nu_i}\right)$$

with increasing 0  $\leq$   $\nu_i$   $\leq$  1 - separation of length-scales in the  $R \rightarrow \infty$  limit

• In the continuum limit  $g^2 \ln(r^2 + a^2) \rightarrow \int_0^1 \rho(\nu) g^2(\nu) \ln\left(r^2 + R^{2\nu}\right) d\nu$ ,

$$F(x) = -\ln R\Phi\left(\frac{\ln x}{\ln R}\right) \quad \Phi(y) = y \int_0^y \rho(\nu) g^2(\nu) \, d\nu + \int_y^1 \nu \rho(\nu) g^2(\nu) \, d\nu,$$

• Exact results for the free-energy  $\mathcal{F}$  in the  $N \to \infty$  limit for any  $\Phi$  ([Fyodorov-JPB])

- For a discrete spectrum  $g^2(\nu)\rho(\nu) = \sum_{i=1}^{K} g_i^2 \delta(\nu \nu_i)$ , the model has exactly the GREM free energy in the limit  $R \to \infty$ .
- For each temperature  $T_p = \sum_{i=p}^{K} g_i^2$  the system freezes within blobs of size  $R^{\nu_p}$  à la REM, with a Parisi  $x = T/T_p$
- The system first freezes at  $T_c = T_1$  on the largest scale
- The last freezing transition takes place at  $T_{\min} = T_K$  on scale  $R^0$
- Each freezing transition is characterized by a participation ratio  $Y_2(R^{\nu_p}) = 1 \frac{T}{T_p}$

- In the continuum limit: an explicit construction of Parisi landscapes in finite Euclidean dimensions in terms of GTI processes
- Multifractal Boltzmann measure

$$Y_q = \int_V p_\beta^q(\mathbf{r}) \, d\mathbf{r} \sim V^{-\tau_q}$$

leads to  $f(\alpha)$  that are generically singular when  $f(\alpha_{\pm}) = 0$ 

• Multiscale dynamical freezing

$$z(\ell_p) = 2 + 2\left(\frac{T_p}{T}\right)^2,$$

all levels such that  $T < T_p$  age (concerning large length scales), whereas small length scales, such that  $T > T_p$ , are still stationary: temperature as a microscope

• Generalized multifractal random walk with epoch dependent multifractal spectrum (discrete)

$$\zeta_n^{(p)} = \frac{n}{2} - \left(\frac{T_p}{T}\right)^2 \frac{n(n-2)}{2}.$$

• Generalized multifractal random walk (continuum limit)

$$\zeta_n = 2m\beta \mathcal{F}(2m\beta) + m[1 - 2\beta \mathcal{F}(2\beta)] \qquad m = \frac{n}{2} \qquad (\tau \sim R)$$

and  $\zeta_n(p)$  with  $p = 1 - \log \tau / \log R$  and  $T_p = \int_p^1 \rho(\nu) g^2(\nu) d\nu$