A mixed SOC-turbulence model for nonlocal transport and space-fractional Fokker-Planck equation



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Outline and Challenges

- Turbulence vs SOC paradigm
 - Transport is intermittent
 - Bursts are important at all scales
 - Particle density flux described by PDF
- Fractional diffusion equation (FDE)
 - with fractional time derivative
 - with fractional space derivative
- 1. SOC (BTW) will produce a time-fractional FDE
- 2. SOC (BTW, DP) will NOT produce space-fractional FDE
- 3. DW turbulence (HW) will NOT produce space-fractional FDE

An additional amplification mechanism is needed to produce a FDE with fractional derivative in space!

Turbulence or Self-organized criticality?





SOC shares with turbulence implications of multi-scale behavior and nonlinear interaction

Both involve many degrees of freedom and scale-free size-distributions of the dynamical entities: vortices in turbulence, avalanches in SOC. No wonder that the notions of turbulence and SOC have been considered difficult to reconcile.



Input K41: Inertial range Kinetic energy density of the turbulent flow: $\varepsilon \propto \frac{1}{2}\rho(\delta u)^2$ **Energy** Nonlinear (eddy turnover) time scale: Transfer $\tau_{_{NI}} \propto \lambda / \delta u$ The energy cascade rate: $\lambda \propto 1/k$ $\dot{\varepsilon} \propto \varepsilon / \tau_{_{NL}} \propto \frac{1}{2} \rho(\delta u)^3 / \lambda$ **Dissipation Assumptions:** space filling, homogeneous, 1. isotropic turbulence $\left\langle \left[u(x+\lambda) - u(x) \right]^2 \right\rangle = 2 \int_{0}^{k_{\text{max}}} E(k') \left[1 - \frac{1}{2} \int_{0}^{k_{\text{max}}} E(k') \right]$ $\sin k'\lambda$ 2. k-independent energy $k'\lambda$ cascade rate u(x) $\delta u \approx u$ $E(k) \propto k^{-5/3}$ $(2\dot{\epsilon} / \rho)^{2/3} \times k^{-2/3}$ $u(x + \lambda)$



Robert H. Kraichnan





Dissipation

- 2 inviscid constants of motion
- 2 formal inertial ranges
 - kinetic energy (-5/3, backward)
 - mean-square vorticity (-3, direct)
- The phenomenon of vortex stretching is forbidden



2D drift-wave turbulence: Hasegawa-Wakatani Eqs

$$\frac{\partial n}{\partial t} + \{\phi, n\} + \frac{\partial \phi}{\partial y} = \frac{1}{\delta}(\phi - n) + \mu_n \nabla^2 n$$

$$\frac{\partial \omega}{\partial t} + \{\phi, \omega\} = \frac{1}{\delta}(\phi - n) + \mu_\omega \nabla^2 \omega$$

$$\omega = \nabla^2 \phi$$

$$\int \text{The Poisson bracket is used to denote the nonlinear terms originating from advection with the ExB drift
$$\{\phi, f\} = (\mathbf{z} \times \nabla \phi) \cdot \nabla f$$

$$\delta = 1/k_{\parallel} L_{\parallel} < 1$$$$

The nonadiabaticity parameter δ characterizes deviation between the potential and the density fluctuations and absorbs the parameters of the parallel dynamics. It constitutes an internal drive for the turbulence, offering a max growth rate $\delta/8$



Properties:

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- No easy parametrization
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- **PDF's** of radial displacements of tracer particles are **non-Gaussian** with **exponential** tails and the moments indicating **superdiffusive transport**

2D drift-wave turbulence

Bursting flux!





Self-organized criticality (SOC) -- NESS...

- A paradigm for complex dissipative systems that relax through bursts
- Self-organized state
 reitical state (at the border of chaos) reached
 without fine tuning of any external or control parameters
- Critical state
 attractor, robust with respect to variations of parameters
 and with respect to randomness



SANDPILE: PROTOTYPE MODEL OF SOC (BTW 1987)



The fundamental physics of the SOC state



Near equilibrium and far from the critical state, the system produces no avalanches

Near criticality and far from equilibrium, series of relaxations of widely varying size are generated

SOC: Cellular-automation (CA) models



If:

the local slope or pressure $z_{i,j}$ exceeds the critical value z_c

Then:

at the next time step (in two dimensions)

$$\begin{split} z_{i,j} & \rightarrow z_{i,j} - 4, \qquad z_{i,j\pm 1} \rightarrow z_{i,j\pm 1} + 1, \\ z_{i\pm 1,j} & \rightarrow z_{i\pm 1,j} + 1 \end{split}$$

In model 2 the slope is increased by repeatedly letting

$$z_{i,j} \rightarrow z_{i,j} + 1$$

at random sites (i, j) and allowing the system to relax following the dynamical rule above. The boundary condition is z = 0.

The fundamental physics of the SOC state



Crackling noise (1/f type noise)

White noise







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Turbulence vs SOC: Boundaries & Dynamical feedback



The SOC phenomena involve a feedback of the relaxation (particle loss) process on the dynamical state of the system at criticality, whereas turbulence pursues as a cascade (simple branching process) in reciprocal space.

SOC hypothesis for edge turbulence in tokamaks

Toroidal ITG gyro-kinetic simulations



[See: Z. Lin et al, Science 281 (1998) 1835]

Fluid resistive interchange turbulence (cylinder)



[See: B.A. Carreras et al, Phys. Fluids B 5 (1993) 1491]

Classic measurements of avalanche-type transport include the analysis of edge plasma turbulence, yielding non-Gaussian probability distribution functions that are long-tailed. One unresolved problem here is the complex nature of coexistence of collective effects due to turbulence, turbulent transport, and SOC.



L-mode tokamak plasmas



The normalized electron temperature fluctuations ($\delta T/T$) for L-mode plasma discharges vs time in the DIII-D tokamak. *The highlighted bands* indicate examples of *avalanche-like events*, outwardly propagating disturbances, moving at 300 m/s.

Fractional diffusion models for radial transport in tokamaks



- 1. D. del-Castillo-Negrete, Phys. Plasmas **13**, 082308 (2006).
- 2. D. del-Castillo-Negrete, B. A. Carreras, and V. E. Lynch, Phys. Plasmas **11**, 3854 (2004).
- 3. R. Sanchez, B. A. Carreras, D. E. Newman, V. E. Lynch, and B. Ph. van Milligen, Phys. Rev. E **74**, 016305 (2006).

Bi-fractional diffusion equation q-moment $\psi(\Delta x)$ $\frac{\partial^{\beta}}{\partial t^{\beta}}n(x,t) = \frac{\partial^{q}}{\partial |x|^{q}} \left[D_{q,\beta}n(x,t) \right]$ $D_{q,\beta} = a^q$ β-moment $\phi(\Delta t)$ $\frac{\partial^{\beta}}{\partial t^{\beta}}n(x,t) = \frac{1}{\Gamma(1-\beta)}\frac{\partial}{\partial t}\int_{0}^{t} dt' \frac{n(x,t')}{(t-t')^{\beta}}$ $0 < \beta \le 1$ G.F. Riemann (1826 - 1866)J. Liouville (1809 - 1882) $\frac{\partial^{q}}{\partial |x|^{q}} n(x,t) = \frac{\cos^{-1}(\pi q/2)}{2\Gamma(p-q)} \times$ $\times \left| \frac{\partial^p}{\partial x^p} \int^x dx' \frac{n(x',t)}{(x-x')^{q-p+1}} - \frac{\partial^p}{\partial (-x)^p} \int^{+\infty} dx' \frac{n(x',t)}{(x'-x)^{q-p+1}} \right|$

Frigves Riesz (1880 - 1956)

Revisiting the realm of Brownian diffusion...



Generalization I: Heavy-tailed waiting time pdf



Generalization II: Heavy-tailed step-size pdf





Sub-, super-, and diffusive transport



Random walks on percolation cluster



- 1. Y. Gefen, A. Aharony, and S. Alexander, Phys. Rev. Lett. **50**, 77 (1983).
- 2. A. V. Milovanov, Phys. Rev. E **79**, 046403 (2009).

Dynamic Polarization Random Walk model



The state of critical percolation occurs dynamically via random walks on a self-adjusting random cluster

Dielectric-relaxation formalism

Polarization response:

$$\delta P(t,\vec{r}) = \int_{-\infty}^{+\infty} \chi(t-t') \delta E(t',\vec{r}) dt'$$
$$\delta P(\omega,\vec{k}) = \chi(\omega) \delta E(\omega,\vec{k})$$

Kramers-Kronig relation:

$$\chi(\omega) \propto \mathrm{P} \int \frac{\sigma_{ac}(\omega')}{\omega'(\omega'-\omega)} d\omega'$$

Linear-response theory for the frequency-dependent conductivity specialized to hopping conduction:

$$\sigma_{ac}(\omega) = \frac{ne^2}{k_B T} D(\omega) \quad \Leftarrow \quad \frac{1}{n_d} D(\omega) = \lim_{\varepsilon \to 0+} \left[(i\omega)^2 \int_0^\infty e^{-i\omega t} e^{-\varepsilon t} \left\langle r^2(t) \right\rangle dt \right]$$



Hopping on percolation geometry:

$$\sigma_{ac}(\omega) \propto \omega^{\eta} \implies \chi(\omega) \propto \omega^{\eta-1}$$

Self-consistent model of dielectric relaxation

Continuity implies that:

$$\frac{\partial}{\partial t}\delta\rho(t,\vec{r}) + \nabla \cdot \frac{\partial}{\partial t}\delta P(t,\vec{r}) = \frac{\partial}{\partial t}\delta\rho(t,\vec{r}) + \nabla \cdot \frac{\partial}{\partial t}\int_{-\infty}^{+\infty} \chi(t-t')\delta E(t',\vec{r})dt' = 0$$

Applying Maxwell's equation we have:

$$\nabla \cdot \delta E(t, \vec{r}) = 4\pi \delta \rho(t, \vec{r}) \implies \frac{\partial}{\partial t} \left[\delta \rho(t, \vec{r}) + 4\pi \int_{-\infty}^{+\infty} \chi(t - t') \delta \rho(t', \vec{r}) dt' \right] = 0$$

In the frequency domain:

$$\delta\rho(\omega,\vec{k}) + 4\pi\chi(\omega)\delta\rho(\omega,\vec{k}) = \phi(\vec{k})/\omega$$
$$\delta\rho(\omega,\vec{k}) = \frac{1}{\omega + T^{-\gamma}\omega^{1-\gamma}}\phi(\vec{k})$$

Distribution of relaxation times

From Mittag-Leffler relaxation function to the Kohlrausch-Williams-Watts stretched-exponential decay function:

$$E_{\gamma}\left[-(t/T)^{\gamma}\right] \cong \exp\left[-(t/T)^{\gamma}/\Gamma(1+\gamma)\right]$$

This stretched-exponential relaxation function can conveniently be considered as a weighted average of single-exponential relaxation functions - each associated with a single relaxation event in the system:

$$\exp\left[-(t/T)^{\gamma}/\Gamma(1+\gamma)\right] \cong \int_{0}^{\infty} d\theta \, w_{\gamma}(\theta) \exp\left[-(t/\theta)\right]$$

where the weighting function is expressible in terms of Levy (stable) distribution

Fractional diffusion equation

The Mittag-Leffler function describes the relaxation dynamics of particles governed by the fractional diffusion equation

$$\frac{\partial}{\partial t}\delta\rho(t,\vec{r}) = {}_{0}D_{t}^{1-\gamma}\kappa_{\gamma}\nabla^{2}\delta\rho(t,\vec{r})$$

where

$${}_{0}D_{t}^{1-\gamma}\delta\rho(t,\vec{r}) = \frac{1}{\Gamma(\gamma)}\frac{\partial}{\partial t}\int_{0}^{t}dt'\frac{\delta\rho(t',\vec{r})}{(t-t')^{1-\gamma}}$$

is the Riemann-Liouville fractional derivative.

This equation is a hallmark of systems with a broad distribution of relaxation times (e.g., the SOC systems)

Critical exponents of the DPRW model

Exponent	Expression	d = 1	d = 2	d = 3	$d = \infty$
η	$\mu/(2\nu+\mu-\beta)$	0	0.34	0.6	1
z	$1 + \eta$	1	1.34	1.6	2
γ	$1-\eta$	1	0.66	0.4	0
lpha	$2-2\eta$	2	1.3	0.8	0
H	1/z	1	0.75	0.6	1/2
au	$3 - lpha z/d_f$	1	2.1	2.5	3

SANDPILE: PROTOTYPE MODEL OF SOC (BTW 1987)



• By examining Table 1 one can see that the DPRW model reproduces with remarkable accuracy the critical exponents from major sand-pile models: Zhang (1989); Tang & Bak (1988).



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Turbulent particle density flux

Particle density flux: flux surface averaged The log-normal distribution as well as the EVD yields a good approximation of the fluxsurface averaged plasma transport



The probability distribution function for the plasma flux across the magnetic field is strongly *non-Gaussian with exponential tails*!

Global model for interchange driven turbulence (Edge-SOL)





Particle density (left) and vorticity (right) during a burst. In the edge/scrape-off layer (SOL) region transport is strongly intermittent and characterized by largeamplitude, radially propagating blob-like structures of particles and heat, generated close to the last closed flux surface. Garcia et al., PPCF **48**, L1 (2006)

Stimulated vortex formation + merging:



Turbulent amplification:

$$\frac{\omega_1 + \omega_2 + \omega_3 + \omega_4 + \dots}{N} \to \text{Gaussian} \quad \Longrightarrow \quad \sqrt{\langle v^2 \rangle} \propto \sqrt{N}$$

Amplification of the range of log-normal behavior:



Space-fractional diffusion equation:

$$\frac{\partial n(x,t)}{\partial t} = \frac{\partial^q}{\partial |x|^q} \Big[D_q n(x,t) \Big]$$

Time-scale separation:

In drift-wave turbulence, the so-called **Rhines length** designates the spatial scale separating vortex motion from drift wave-like motion

$$\lambda_{\rm Rh} \propto \sqrt{{
m u}_{E imes B}}$$

$$\tau_{\rm turn} \propto \lambda_{\rm Rh} / {\rm u}_{E \times B} \propto 1 / \sqrt{{\rm u}_{E \times B}}$$



Avalanching dynamics:

 $\tau_{\rm turn} << \gamma_{\rm L}^{-1}$



The nonadiabaticity parameter, δ , characterizes deviation between the potential and the density fluctuations in the Hasegawa-Wakatani (HW) model

$$\gamma_{\rm L} \approx \delta/8$$

Vortex avalanches: Propagating drift-wave turbulence



Self-Organized Critical Directed Percolation:



$$q \approx 1.7 \ (= 1.73 \pm 0.05)$$

Maslov & Zhang, 1996

Stimulated galaxy formation:



If the original process of galaxy formation occurs through the stimulated birth of one galaxy due to a nearby recently formed galaxy, and if this process occurs near its percolation threshold, then a hierarchical structure with power-law correlations arises at the time of galaxy formation.

Schulman & Seiden, 1986



Amplification mechanism provided by galaxy merging



Conclusions

- An amplification mechanism is needed to introduce nonlocality into the dynamics
- Amplification of a log-normal distribution generates a new distribution of the Levy type
- Synergetic coupling between SOC and turbulence: Amplification of SOCassociated avalanches via the inverse turbulence cascade produces largeamplitude bursts of transport
- Consistent derivation of a Levy fractional diffusion equation: A random walker driven by a Levy white noise
- Nonlocal diffusion explains the behavior of cold pulses

A mixed SOC-turbulence model for nonlocal transport and spacefractional Fokker-Planck equation

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Abstract. - The phenomena of nonlocal transport in magnetically conned plasma are theoretically analyzed. A hybrid model is proposed, which brings together the notion of inverse energy cascade, typical of drift-wave and two-dimensional fluid turbulence, and the ideas of avalanching behavior, associable with self-organized critical (SOC) behavior. Using statistical arguments, it is shown that an amplification mechanism is needed to introduce nonlocality into dynamics. We obtain a consistent derivation of nonlocal Fokker-Planck equation with space-fractional derivatives from a stochastic Markovian process with the transition probabilities defined in reciprocal space.