## Self-similarity in random collision processes

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Kinetics of collision processes with linear mixing rules are investigated analytically. The velocity distribution becomes self-similar in the long-time limit and the similarity functions have algebraic or stretched exponential tails. The characteristic exponents are roots of transcendental equations and vary continuously with the mixing parameters. In the presence of conservation laws, the velocity distributions become universal.

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Collision processes underlie fundamental phenomena such as heat transport in gases [1] and mixing in fluid flows [2]. Conservation of mass, momentum, and energy implies Maxwellian velocity statistics [3]. However, there are physical systems such as granular media [4] and atomic collisions [5] where energy or even momentum [6] is not conserved. The reason may be that only a subset of the system is considered, that not all degrees of freedom are measured [twodimensional (2D) imaging of 3D systems], or that acoustic or other excitations are ignored. Non-Maxwellian velocity statistics are found in granular gases [7], colloids [8], and laser cooling [9].

Random collision processes are a framework for studying the role of conservation laws, and demonstrate how anomalous velocity statistics emerge when conservation laws are relaxed [10–13]. Motivated by this, we consider binary collision processes with *arbitrary* linear collision rules. While in the long-time limit velocity distributions are generically self-similar, there is a wide spectrum of possible behaviors. The velocity distributions are characterized by algebraic or stretched exponential tails and the corresponding exponents depend sensitively on the collision parameters. Interestingly, when there is energy or momentum conservation, the behavior is universal.

Consider the most general linear collision law in one dimension: when a particle of velocity  $u_1$  collides with a particle of velocity  $u_2$ , the postcollision velocities are

$$v_{1,2} = p u_{1,2} + q u_{2,1}, \tag{1}$$

with p and q the mixing parameters. Special cases include elastic collisions (p=0, q=1), inelastic collisions (p+q=1), the granules model (p+q<1) [6], the Kac Model  $(p^2+q^2=1)$  [14], inelastic Lorenz gas (p=0, q<1) [15], and addition (p=q=1) [16].

Further, we consider perfectly random dynamics: two randomly chosen particles collide according to Eq. (1). The normalized velocity distribution P(v,t) obeys

$$\frac{\partial}{\partial t}P(v,t) = \int \int du_1 du_2 P(u_1,t)P(u_2,t) \\ \times [\delta(v - pu_1 - qu_2) - \delta(v - u_1)].$$
(2)

This Boltzmann equation is termed the Maxwell model in kinetic theory (the constant collision rate is set to unity) [17]. The quadratic integrand in Eq. (2) reflects the binary nature of the collision process and the gain term reflects the collision rule (1). The number density is conserved by Eq. (2),  $\int dv P(v,t) = 1$ .

The convolution structure of the evolution equation suggests the Fourier transform  $F(k,t) = \int dv e^{ikv} P(v,t)$ . This quantity obeys the nonlinear and nonlocal equation

$$\frac{\partial}{\partial t}F(k,t) + F(k,t) = F(pk,t)F(qk,t).$$
(3)

This closed equation is amenable to analytical treatment. Moments of the velocity distribution,  $M_n(t) = \int dv v^n P(v,t)$ , obey a closed hierarchy of equations [18]

$$\frac{d}{dt}M_n + \lambda_n M_n = \sum_{m=1}^{n-1} \binom{n}{m} p^m q^{n-m} M_m M_{n-m}$$
(4)

with the shorthand notation  $\lambda_n = 1 - p^n - q^n$ . These equations are solved recursively with  $M_0(t) = 1$ .

We are interested in the long-time limit and we seek similarity solutions of the form

$$P(v,t) \rightarrow e^{\alpha t} \Phi(v e^{\alpha t}), \text{ as } t \rightarrow \infty.$$
 (5)

Equivalently, the Fourier transform has the similarity form  $F(k,t) \rightarrow f(ke^{-\alpha t})$ . This function satisfies

$$-\alpha z f'(z) + f(z) = f(pz)f(qz).$$
(6)

The similarity function may include both a regular and a singular (nonanalytic) component  $f(z)=f_{reg}(z)+f_{sing}(z)$  with  $f_{reg}(z)=\sum_n[(iz)^n/n!]f_n$ . Normalization sets  $f_0=1$ . The leading small-z behavior of the singular component,  $f_{sing}(z)\sim z^{\nu}$ , reflects an algebraic tail of the velocity distribution

$$\Phi(w) \sim w^{-\nu - 1},\tag{7}$$

as  $w \to \infty$ . Substituting the leading singular behavior  $f(z) - 1 \sim z^{\nu}$  into the governing equation (6) yields a relation between the scaling parameter  $\alpha$  and the mixing parameters p and q,



FIG. 1. The phase diagram for type-I scaling. Shown are equi- $\nu$  contours as a function of the mixing parameters.

$$\alpha = \nu^{-1} \lambda_{\nu}. \tag{8}$$

There are two types of scaling solutions, depending on the average initial velocity  $M_1(0)$ : type-I scaling  $[M_1(0)\neq 0]$  and type-II scaling  $[M_1(0)=0]$ . Note that the system is not Galilean invariant because momentum is not necessarily a conserved quantity.

Type-I scaling. The first moment varies exponentially with time,  $M_1 = e^{-\lambda_1 t}$ , according to the rate equation  $(d/dt)M_1 + \lambda_1 M_1 = 0$  (its initial value can be set to unity). The small wave-number behavior of the regular component of the Fourier transform is therefore  $F(k,t) \cong 1 + ike^{-\lambda_1 t}$ . When  $\nu > 1$ , this component dominates over the singular component. Therefore,  $f(z) \cong 1 + iz$  and the scaling parameter is  $\alpha = \lambda_1$ . When  $\nu < 1$ , the singular component dominates over the regular one, so the parameter  $\alpha$  is not obvious. There is a spectrum of possible  $\alpha$ 's depending on  $\nu$  according to the "dispersion" curve (8). This curve has a maximum  $\alpha = (d/d\nu)\lambda_{\nu}$  at  $\nu$  given by  $\nu(d/d\nu)\lambda_{\nu} = \lambda_{\nu}$ . We argue that this maximum is actually realized by the dynamics. Intuitively, the selection of the extremum point maximizes the typical wave number  $\propto e^{\alpha t}$ . The scaling parameter is therefore

$$\alpha = \begin{cases} p^{\nu} \ln \frac{1}{p} + q^{\nu} \ln \frac{1}{q}, & \nu \leq 1 \\ 1 - p - q, & \nu \geq 1. \end{cases}$$
(9)

The exponent  $\nu$  characterizing the algebraic tails is the root of the transcendental equation (8) with  $\alpha$  given by Eq. (9). Explicitly, the equations are  $p^{\nu} \ln(e/p^{\nu}) + q^{\nu} \ln(e/q^{\nu}) = 1$  and  $1 - p^{\nu} - q^{\nu} = \nu(1 - p - q)$  for  $\nu \leq 1$  and  $\nu \geq 1$ , respectively (Fig. 1).

Algebraic tails exist as long as the exponent  $\nu$  is finite. The exponent diverges,  $\nu \rightarrow \infty$ , in the limiting cases p+q = 1, p=1, and q=1, defining the triangular region S (Fig. 1). In this domain, the singular component disappears and the scaling function f(z) is analytic. Moreover, the velocity distribution  $\Phi(w)$  has sharp tails and all of its moments are finite. Outside the region S, the exponent  $\nu$  is always finite. It



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FIG. 2. The phase diagram for type-II scaling.

varies continuously as a function of the mixing parameters and it vanishes,  $\nu \rightarrow 0$ , when  $p \rightarrow 0$  or  $q \rightarrow 0$ .

The curve  $p \ln(e/p)+q \ln(e/q)=1$ , marking the case  $\nu = 1$ , separates two kinds of behavior. When  $\nu > 1$  the first moment characterizes the velocity distribution. In the complementary case, the typical velocity does not follow from the (integer) moment behavior. This dichotomy is reminiscent of similarity solutions of the first and second kind [19]. Interestingly, extremum selection determines the typical velocity and thereby the velocity distribution when  $\nu < 1$ . Extremum selection similarly governs the speed and the shape of nonlinear waves in reaction-diffusion problems [20,21]. Indeed, in terms of the variable  $\ln v$ , the similarity solution (5) is nothing but a travelling wave  $\tilde{P}(\ln v,t) \rightarrow \tilde{\Phi}(\ln v + \alpha t)$ .

*Type-II scaling.* When the average initial velocity vanishes, the initial variance can be set to unity. From the moment equations (4), the variance varies exponentially with time,  $M_2(t) = e^{-\lambda_2 t}$ . The small-wave-number behavior  $F(k,t) \cong 1 - \frac{1}{2}k^2 e^{-\lambda_2 t}$  dominates when  $\nu > 2$  and consequently, the second moment characterizes the velocity distribution,  $\alpha = \frac{1}{2}\lambda_2$ . Otherwise, the singular component governs the behavior as above and the scaling parameter is

$$\alpha = \begin{cases} p^{\nu} \ln \frac{1}{p} + q^{\nu} \ln \frac{1}{q}, & \nu \leq 2\\ \frac{1}{2}(1 - p^2 - q^2), & \nu \geq 2. \end{cases}$$
(10)

The exponent  $\nu$  characterizing the algebraic tails is the root of the transcendental equation  $p^{\nu} \ln(e/p^{\nu})+q^{\nu} \ln(e/q^{\nu})=1$  for  $\nu \le 2$  and  $1-p^{\nu}-q^{\nu}=(\nu/2)(1-p^2-q^2)$  for  $\nu \ge 2$  (Fig. 2). It diverges in the vicinity of the curves p=1, q=1, and  $p^2+q^2=1$ . Inside this region *S*, the similarity solution f(z) is regular and the velocity distribution  $\Phi(w)$  has sharp tails. Generally, similarity solutions are symmetric, as f(z)=f(-z).

The diverging exponent  $\nu$  indicates that the large velocity tail is a stretched exponential, rather than algebraic, in the region S. Indeed, the Fourier transform  $f(z) \sim \exp(-z^{\mu})$  for large z is compatible with the governing equation (6) when



FIG. 3. Self-similarity in type-I scaling. Shown is  $\Phi(w)$  versus *w* for the case p = q = 0.4 ( $\alpha = 0.2$ ). In the inset, the tail is compared with the theoretical prediction  $\nu = 4.88636$ .

$$\lambda_{\mu} = 0. \tag{11}$$

Steepest descent yields a stretched exponential behavior

$$\Phi(w) \sim \exp(-w^{\gamma}), \tag{12}$$

with  $\gamma = [\mu/(\mu-1)]$  for  $w \to \infty$ . As was the case for the exponent  $\nu$ ,  $\mu$  is a root of a transcendental equation and consequently, the exponent  $\gamma \ge 1$  varies continuously with the mixing parameters. Its minimal value  $\gamma = 1$  is attained along the region boundaries p = 1 and q = 1. The tail is Gaussian,  $\gamma = 2$ , along the type-II boundary  $\lambda_2 = 0$  and the exponent diverges,  $\gamma \to \infty$ , along the type-I boundary  $\lambda_1 = 0$ .

Self-similarity holds whether the typical velocity shrinks or grows with time, i.e., regardless whether  $\alpha$  is positive or negative. For type-I scaling the velocities shrink (grow) with time when  $\lambda_1 > 0$  ( $\lambda_1 < 0$ ) and similarly for type-II scaling.

Asymptotically, sufficiently small moments of the velocity distribution are governed by the typical velocity. Otherwise, the moment behavior follows from the hierarchy of evolution equations (4),

$$M_n \sim \begin{cases} \exp(-n\,\alpha t), & n < \nu \\ \exp(-\lambda_n t), & n > \nu \end{cases}.$$
(13)

Sufficiently small moments of the velocity distribution exhibit ordinary scaling behavior while sufficiently large moments exhibit multiscaling asymptotic behavior [22]. By multiscaling, we refer to moment ratios such as  $M_n/M_2^{n/2}$  that diverge asymptotically.

Extensive numerical simulations confirm the theoretical findings. In the simulations, randomly chosen pairs of particles undergo the collision process (1). The number of particles was  $10^7$  and the velocity distributions were obtained from an average over ten independent realizations. Representative simulation results corresponding to flat initial distributions with support in [0:1] and [-1:1] are shown in Figs. 3 and 4, respectively.

There are a number of special cases worth highlighting.

Addition (p=q=1). This integrable case nicely demonstrates how similarity solutions emerge. The transformation

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FIG. 4. Self-similarity in type-II scaling. Shown is  $\Phi(w)$  versus *w* for the case p=q=0.6 ( $\alpha=0.14$ ). The inset compares the tail with the theoretical prediction  $\nu=6.669$  37.

G(k,t) = 1/F(k,t) reduces the (local) Ricatti equation (3) into  $[\partial/\partial t]G(k,t) + G(k,t) = 1$ . The Fourier transform reads  $F(k,t) = \{1 + [F_0^{-1}(k) - 1]e^t\}^{-1}$  with  $F_0(k) \equiv F(k,t=0)$ . Indeed, the small-wave-number behavior of the initial distribution  $F_0(k)$  dictates the asymptotic behavior. When  $M_1(0) = 1$ , type-I scaling occurs, with the similarity solution  $f(z) = [1 - iz]^{-1}$  and  $\Phi(w) = e^{-w}$  for w > 0. When  $M_1(0)$ = 0, type-II scaling occurs, with the similarity solution  $f(z) = [1 + \frac{1}{2}z^2]^{-1}$  and  $\Phi(w) = (1/\sqrt{2})\exp(-\sqrt{2}|w|)$ . One can verify that these similarity solutions satisfy Eq. (6) with  $\alpha = 1$  and 1/2 for type I and type II, respectively.

Kac Model  $(p^2+q^2=1)$ . For type-II scaling, energy is conserved, but only on average, since  $\lambda_2=0$ . In this case, the velocity distribution approaches a steady state,  $\alpha=0$ . Equation (3) has the solution  $f(z) = \exp(-z^2/2)$  and the velocity distribution is Maxwellian,  $\Phi(w)$  $=(2\pi)^{-1/2} \exp(-w^2/2)$ . For type-I scaling, energy is not conserved and the velocity distribution is no longer universal. However, it still exhibits a Gaussian tail.

Inelastic Maxwell model (p+q=1). For inelastic collisions, the total momentum is conserved,  $\lambda_1=0$ . Using the Galilean transformation  $v \rightarrow v - M_1(0)$ , the initial momentum can be set to zero and so the behavior is always of type II. The exponent  $\nu=3$  is the root of the equation  $\lambda_{\nu} = (\nu/2)\lambda_2$ . In this particular case, an explicit solution can be found  $f(z) = (1+|z|)e^{-|z|}$  or  $\Phi(w) = (2/\pi)(1+w^2)^{-2}$  [10]. Interestingly, when there is a conservation law (either momentum or energy), the similarity solution is independent of the mixing parameters.

*Lorentz gas* (p=0). This case corresponds to inelastic collisions with massive scatterers. The evolution equation is linear,  $(\partial/\partial t)P(v,t)+P(v,t)=q^{-1}P(vq^{-1},t)$ . It is useful to consider the stochastic process the velocity undergoes  $v \rightarrow vq \rightarrow vq^2 \rightarrow \cdots$ . The number of collisions is distributed according to a Poisson distribution with mean equal to time *t*. Therefore, the velocity distribution [23] is

$$P(v,t) = e^{-t} \sum_{n=0}^{\infty} \frac{t^n}{n!} \frac{1}{q^n} P_0\left(\frac{v}{q^n}\right).$$
(14)

In other words, the variable  $\ln v$  is Poisson distributed with mean equal to  $t \ln q$ , so a finite number of standard deviations away from the mean  $\ln v$  is Gaussian distributed. Thus, the tail of the distribution is log-normal,  $P(v) \sim \exp[-(\ln v)^2/(2t \ln q)]$ . In the limit  $v \rightarrow 0$ , no similarity solutions emerge and all moments of the velocity distribution exhibit multiscaling,  $M_n(t) = M_n(0)\exp(-\lambda_n t)$ . We conclude that the linear collision process (1) is an effective mixing mechanism. No matter how small either of the mixing parameters is, eventually, the binary collision process alters the nature of the velocity distribution. In other words, nonlinearity provides the mechanism for the self-similar behavior.

The usual physical particle collision region is associated with  $0 \leq p + q \leq 1$ [6] and restitution coefficient  $0 \le q - p \le 1$ . Other applications may involve values of p and q outside this region. We implicitly assumed that the mixing parameters are positive  $(p,q \ge 0)$  but the behavior easily extends to the other three quadrants in the p-q plane. Consider the first two moments  $M_1(t) = M_1(0) \exp(-\lambda_1 t)$  and  $M_2(t)$  $= [M_2(0) - cM_1^2(0)]e^{-\lambda_2 t} + cM_1^2(0)e^{-2\lambda_1 t}$ with С = $(2pq)/(\lambda_2 - 2\lambda_1)$ . The first moment governs the second moment  $(M_2 \sim M_1^2)$  when  $\lambda_2 > 2\lambda_1$ , i.e., in the circular domain  $(p-1)^2 + (q-1)^2 < 1$ , which is entirely contained in the first quadrant. Thus, type-I scaling occurs only in the first

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quadrant. Type-II scaling occurs in the other three quadrants, regardless of  $M_1(0)$ .

We tacitly assumed that all moments are finite initially. Consider initial distributions with a leading small-*k* behavior of the type  $1 - F_0(k) \sim k^{\nu_0}$ , competing with  $f_{\text{sing}}(z) \sim z^{\nu}$ . The initial conditions govern the asymptotic behavior when  $\nu_0 < \nu$  and thus,  $\alpha = \nu_0^{-1} \lambda_{\nu_0}$ . This generalization of the previous results applies for both type-I scaling ( $\nu_0 = 1$ ) and type-II scaling ( $\nu_0 = 2$ ).

In closing, random and linear mixing results in selfsimilar velocity distributions. Nonlinearity is responsible for this scaling and extremum selection may govern the behavior. The velocity distributions have either algebraic or exponential tails, with nontrivial characteristic exponents. Every possible algebraic tail and every faster than exponential decay constitutes the spectrum of behaviors. Conservation laws play a crucial role, as the velocity distribution becomes universal when physical quantities (either energy or momentum) are conserved.

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