Superdiffusive stochastic Fermi acceleration in space and energy

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Accepted 2019 November 18. Received 2019 November 18; in original form 2019 October 17

ABSTRACT

We analyse the transport properties of charged particles (ions and electrons) interacting with randomly formed magnetic scatterers (e.g. large-scale local 'magnetic fluctuations' or 'coherent magnetic irregularities' usually present in strongly turbulent plasmas), using the energization processes proposed initially by Fermi in 1949. The scatterers are formed by large-scale local fluctuations ($\delta B/B \approx 1$) and are randomly distributed inside the unstable magnetic topology. We construct a 3D grid on which a small fraction of randomly chosen grid points are acting as scatterers. In particular, we study how a large number of test particles are accelerated and transported inside a collection of scatterers in a finite volume. Our main results are: (1) The spatial mean-square displacement $\langle (\Delta r)^2 \rangle$ inside the stochastic Fermi accelerator is superdiffusive, $< (\Delta r)^2 > t^{a_r}$, with $a_r \sim 1.2 - 1.6$, for the high-energy electrons with kinetic energy (W) larger than 1 MeV, and it is normal $(a_r = 1)$ for the heated low-energy (W < 10 keV) electrons. (2) The transport properties of the high-energy particles are closely related with the mean-free path that the particles travel in-between the scatterers (λ_{sc}). The smaller λ_{sc} is, the faster the electrons and ions escape from the acceleration volume. (3) The mean displacement in energy $\langle \Delta W \rangle \sim t^{a_W}$ is strongly enhanced inside the acceleration volume ($a_W = 1.5-2.5$) for the high-energy particles compared to the thermal low-energy particles ($a_W = 0.4$), i.e. high-energy particles undergo an enhanced systematic gain in energy. (4) The mean-square displacement in energy $\langle W^2 \rangle$ is superdiffusive for the high-energy particles and normal for the low-energy, heated particles.

Key words: Sun: corona – turbulence – Sun: Solar flares – acceleration of particles – Plasmas – Diffusion.

1 INTRODUCTION

Stochastic Fermi acceleration is a very broad term for particles interacting with any kind of scattering centres, e.g. large amplitude magnetohydrodynamic (MHD) disturbances, current sheets, and waves from electromagnetic (em) resonances. The interaction of particles with waves was called 'the modern version' of stochastic Fermi acceleration in order to distinguish it from the original version proposed by Fermi in 1949 (Fermi 1949).

The interaction of particles with em fields inside an unstable magnetized plasma is an important process for the acceleration and transport of particles in laboratory and astrophysical plasmas. In realistic space, astrophysical, or laboratory plasmas, the 3D evolution of the em fields is usually analysed, up to now, with the use of the resistive MHD equations. The evolution of the particles inside the em fields is followed by using either the test particle approach or with the use of transport equations.

Depending on the amplitude of the fluctuating em fields, the interaction of the particles and fields is dramatically different. For small amplitude plasma waves, the dispersion relation for the linearized system ($\omega = \omega(\mathbf{k})$) is valid and the magnetic fluctuations can be expressed as

$$\delta \boldsymbol{B}(\boldsymbol{x},t) = \sum_{k_{\min}}^{k_{\max}} \boldsymbol{B}_{k0} \exp[i(\boldsymbol{k} \cdot \boldsymbol{x} - \boldsymbol{\omega}(\boldsymbol{k})t + \boldsymbol{\phi}_{k}]], \tag{1}$$

where B_{k0} is the amplitude of the waves, k is the wave vector and ϕ_k is the random phase of the specific wave mode. The magnetic field is given through the expression $B(x, t) = B_0 + \delta B(x, t)$ and the electric field writes $E(x, t) = 0 + \delta E(x, t)$, where

$$\operatorname{rot} \delta \boldsymbol{E} = -c^{-1} \frac{\partial \delta \boldsymbol{B}}{\partial t}.$$

 B_0 is the ambient magnetic field, and the ensemble averages are $\langle \delta B \rangle = \langle \delta E \rangle = 0$. Several analytical and numerical tools are available for the study of the wave–particle interaction when the (possibly unstable) em fluctuations are weak ($|\delta B| < \langle |B_0|$.) We must stress here that only weak turbulence can be represented by a discrete number of normal modes of the plasma.

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Stochastic (second-order) Fermi acceleration of particles can be analysed with at least two very well-known techniques: (1) Test particle simulations inside em fluctuations described by equation (1) (Perri, Greco & Zimbardo 2009; Greco, Perri & Zimbardo 2010; Perri, Zimbardo & Greco 2011). (2) The solution of the quasilinear (QL) equation (Kennel & Engelmann 1966). The QL equation is used extensively for the analysis of the interaction of charged particles with partially random em fields. The OL equation is derived from the first-order expansion of the fluctuating em fields $(\delta B/B_0)^2$, assuming that all higher order terms are zero in weak turbulence. The limits of the QL approximation have been explored by using test particle simulations (Kuramitsu & Hada 2000; Zacharegkas, Isliker & Vlahos 2016). The standard QL approach also assumes incoherent mode coupling of the fluctuating em fields, described by the superposition of individual plasma wave modes. The em fields are assumed known and not evolving, so the response of the particle energy distribution can be calculated (see Davis 1956; Tverskoi 1967; Kulsrud & Ferrari 1971; Achterberg 1981; Schlickeiser 1989 and the reviews by Miller et al. 1997; Melrose 2009; Petrosian 2012).

A more general framework to treat the acceleration and transport of particles from stochastic em fields is the Fokker–Planck (FP) transport equation (Gardiner 1994). The FP is valid when several approximations for the nature of the em fluctuations are valid.

The main assumption is that the statistical properties of the interaction of the charged particles with the fields are dominated by Gaussian distributions. This is in correspondence with the Central Limit Theorem (CLT), which requires that all stochastic systems evolve asymptotically towards Gaussian statistics provided that (i) many interactions are involved, (ii) the change in state in individual interactions is always small, and (iii) subsequent changes of state are statistically independent of each other. Besides these necessary conditions for the applicability of the FP equation, also other simplifying assumption for a better tractability of the FP equation are being made, such as (1) the magnetic fluctuations are homogeneous in space, (2) the electromagnetic fields are quasistatic, (3) the interaction has a finite decorrelation time, etc. (see more details in the books Schlickeiser 2003; Zank 2014). Unfortunately, in astrophysical and laboratory plasmas, most of the above assumptions are not valid, yet the FP equation is used extensively, without a proof of its validity. This is especially true when the plasma particles are accelerated to high energies impulsively (e.g. in solar flares, coronal mass ejections, or the Earth's magnetotail). The acceleration volume is finite and the expected fluctuating electromagnetic fields are strong $(|\delta B| \ge |B_0|)$. In solar active regions, the complex magnetic topologies host many null magnetic points which are randomly distributed inside the erupting or flaring volume (Aulanier et al. 2000; Pontin 2011). In these cases, the interaction of the particles with the strong em disturbances is transient and has no time to lead to Gaussian statistics or to become homogeneous in space (Isliker, Archontis & Vlahos 2019). Before analysing the interaction of the particles with the em fluctuations, it is important to understand the evolution of the em waves. With the use of resistive MHD codes one can show that a spectrum of high amplitude electromagnetic fluctuations evolves rapidly and leads to a fragmented current system, where reconnecting current sheets and large amplitude magnetic fluctuations are present (Arzner & Vlahos 2004; Dmitruk, Matthaeus & Seenu 2004; Vlahos, Isliker & Lepreti 2004; Isliker, Vlahos & Constantinescu 2017a), and where the various statistics clearly are non-Gaussian, following largely the paradigm of the stable Levy distributions (Isliker et al. 2017a; Isliker et al. 2019). In strongly turbulent plasmas, the magnetic fluctuations

are non-collective modes and cannot be described with a simple dispersion relation $\omega = \omega(\mathbf{k})$. The em environment generated from the evolution of large amplitude em fluctuations is well documented in the current literature and models much better many impulsive astrophysical and laboratory plasmas (see Dmitruk et al. 2004; Zhdankin et al. 2013; Isliker et al. 2017a and the reviews by Cargill et al. 2012; Karimabadi et al. 2014; Vlahos & Isliker 2019).

We pose in this article the following question: 'Can we analyse acceleration and transport of particles in a finite and strongly turbulent magnetized plasma with the use of the FP transport equation?'.

We analyse the transport of particles in space and energy in a strongly turbulent environment, where particles gain and lose energy stochastically, following the second-order Fermi acceleration scenario (Fermi 1949). In Section 2, we introduce the main concepts of stochastic acceleration and the basic tools available to study non-Gaussian (anomalous) transport. In Section 3, we present our model and in Section 4, our results. In the final section, we discuss the astrophysical implications of our study and summarize the main points and the limitations of our analysis.

2 STOCHASTIC ACCELERATION AND ANOMALOUS TRANSPORT

The simplest way to model the kinetic properties of an ensemble of particles in the presence of em fields is to assume that the system particles and fields are very close to equilibrium and that the particles perform a Brownian motion (random walk) among the scattering fields, with a well-defined mean displacement between encounters (mean-free path $\delta r \approx \lambda_{sc}$). Another way to describe mathematically the random walk inside a system with homogeneously distributed scatterers (magnetic fluctuations or magnetic clouds) is to define the probability density of the step size of the random walk $q(\delta r)$. Based on the CLT, in all large systems the random steps will asymptotically attain a Gaussian distribution. In this case, the mean square displacement, when assuming constant time-steps, will be

$$\langle (\Delta r)^2 \rangle = D_0 t, \tag{2}$$

where the transport coefficient for normal transport is $D_0 = v\lambda_{sc}$, and where v is the constant velocity of the particles. It is easy to connect this analysis with the derivation of the FP equation (for details see the tutorials Vlahos et al. 2008; Bovet 2015).

Many systems are far from equilibrium and violate many of the assumptions listed above. Transport in systems far from equilibrium is termed 'anomalous' or 'non-Gaussian'. A simple way to characterize the anomalous transport properties is to estimate the mean square displacement $(\Delta r)^2$. It has been shown that the mean square displacement usually changes faster or slower with time than in the case of normal diffusion when fluids or plasmas are strongly turbulent

$$<(\Delta r)^2>=D_r t^{a_r},\tag{3}$$

where a_r can be smaller than one, which is called subdiffusion or $1 < a_r$, and which is called superdiffusion. When $a_r = 2$, the transport is termed ballistic (for a quick overview see Shlesinger, Zaslavsky & Klafter 1993; Klafter, Shlesinger & Zumofen 1996 or the review by Metzler & Klafter 2000, 2004). When particles move with constant velocity and are temporarily trapped inside the scatterers, then their transport is subdiffusive ($a_r < 1$). Superdiffusion means that the particle trajectories involve Levy flights, besides regular steps, during the motion in space (Zimbardo et al. 2015), superdiffusive if a space transport regimes are thus based on Levy-type statistics if

the velocity is assumed to remain constant, i.e. the probability distributions of the step sizes are characterized by power-law tails, rather than following Gaussian statistics. The theoretical description of anomalous transport involves the use of a variety of tools and models, like the estimate of Hurst exponents, and the construction of fractional transport equations (e.g. Eule et al. 2012), not always though it is clear which model is the most appropriate to describe a specific physical system.

Anomalous transport has been found in a large variety of physical systems (Zimbardo et al. 2010; Perrone et al. 2013). In space and astrophysical plasmas, non-classical transport and the coupling of particles with strong em fields is common. The wealth of transport studies during the recent decades has shown the existence of a variety of regimes that differ from the classical QL regime (Zimbardo et al. 2010; Perrone et al. 2013).

All the above studies decoupled the spatial transport from the acceleration of particles. They assume that inside the acceleration volume the particles diffuse only in velocity space, and when they escape from the acceleration region they travel in an environment where only spatial transport is analysed (Perri & Zimbardo 2007). In the well-known stochastic (second-order) Fermi acceleration, used extensively in space and astrophysical plasmas, the spatial transport and the acceleration of particles are coupled. Scatterers (magnetic clouds or large amplitude magnetic disturbances) are not just changing the direction of propagation or the steps of the 'walk' of the particles, but they also change stochastically their velocity (Fermi 1949). If W is the kinetic energy of a particle and the particle moves with relativistic velocity v and the scatterers ('magnetic clouds') move with mean speed V, which is much smaller than the speed of light, then the energy loss or gain of the particles interacting with the scatterers is

$$\frac{\delta W}{W} \approx \frac{2}{c^2} (V^2 - V \cdot \boldsymbol{v}), \tag{4}$$

where for overtaking collisions $V \cdot v > 0$ and the particles lose energy, for head-on collisions $V \cdot v < 0$ and the particles gain energy. The rate of energy gain is estimated through the relation

$$\frac{\mathrm{d}W}{\mathrm{d}t} = \frac{W}{t_{\mathrm{acc}}},\tag{5}$$

where

$$t_{\rm acc} = \left(\frac{3c}{4V^2}\right)\lambda_{\rm sc},\tag{6}$$

and λ_{sc} is the mean-free path the particles travel between the scatterers and t_{acc} is the acceleration time (see Longair 2011). On assuming a uniform distribution of the scatterers inside the acceleration volume with density n_{sc} , the mean-free path is $\lambda_{sc} \approx \frac{1}{\sqrt{n_{sc}}}$. The assumption that the scatters are distributed uniformly in space is a strong assumption for turbulent systems, since the latter tend to be highly anisotropic and thus also the distribution of the scatterers may not be isotropic or form a fractal structure. We assume that the particles are not trapped inside the scatterers, i.e. their interaction is instantaneous. A key parameter for the efficient acceleration of particles inside a turbulent volume is the escape time (t_{esc}) from the energy release volume. In second-order Fermi acceleration, the spectral index of the high-energy particles depends on the ratio t_{acc}/t_{esc}

$$f(W) \approx W^{-k} \tag{7}$$

where $k = 1 + t_{acc}/t_{esc}$ (Longair 2011). Therefore, the correct estimate of the transport properties inside a finite acceleration

volume is very important for the understanding of many transient astrophysical sources.

The transport of particles inside an acceleration volume has been analysed using analytical and numerical tools by several authors (Bouchet, Cecconi & Vulpiani 2004; Stawicki 2005; Tsironis & Vlahos 2005; Perri et al. 2007; Pisokas et al. 2017). Bouchet et al. (2004) analysed the stochastic Fermi acceleration using a simplified model, and they concluded that both the velocity and position mean square displacements

$$<\left(\Delta r(t)\right)^2>\approx t^{a_r}\tag{8}$$

$$<(\Delta v(t))^2>\approx t^{a_v} \tag{9}$$

are superdiffusive, and the probability distributions of the positions and velocities are non-Gaussian.

The role of anomalous transport upstream of a shock during diffusive shock acceleration has been analysed in detail (Perri & Zimbardo 2007, 2008; Perri et al. 2009; Zimbardo & Perri 2013). It was shown that electron transport upstream of the shocks that are associated with corotating interaction regions, detected by the Ulysses spacecraft in the solar wind at 4–5 au, is superdiffusive with $a_r \approx 1.1$ –1.7. The astrophysical implications of superdiffusive shock acceleration are discussed in several articles and reviews (Perri & Zimbardo 2012; Zimbardo et al. 2015).

3 OUR MODEL

We construct a 3D grid $(N \times N \times N)$ with grid size $\ell = L/(N - 1)$, and with linear extent *L*. Each grid point is set to either *active* or *inactive*, i.e. it is a scatterer or not. Only a small fraction $R = N_{sc}/N^3$ of the grid points are set to active (5-15 per cent). We can define the density of the scatterers as $n_{sc} = R \times N^3/L^3$, and the mean-free path of the particles between scatterers can be determined as $\lambda_{sc} = \ell/R$. When a particle (an electron or an ion) encounters an active grid point, it renews its kinetic energy state according to equation (4), as it holds for stochastic Fermi acceleration. It then moves in a random direction along the grid

$$\boldsymbol{r}^{n+1} = \boldsymbol{r}^n + \delta \boldsymbol{r}^n \tag{10}$$

with its renewed velocity

$$\boldsymbol{v}^{n+1} = \boldsymbol{v}^n + \delta \boldsymbol{v}^n \tag{11}$$

during the step *n*, until it meets another active point or exits the grid. The minimum distance between two scatterers is the grid size (ℓ) . The time between two consecutive scatterings is $\delta t^n = |\delta \mathbf{r}^{in}|/|\mathbf{v}^n|$. At time t = 0 all particles are located at random positions on the grid. The injected distribution n(W, t = 0) is a Maxwellian with temperature T. The initial direction of motion of every particle is selected randomly. The parameters used in this article are related to the typical plasma parameters in the low solar corona. We choose the strength of the magnetic field to be B = 100 G, the density of the plasma $n_0 = 10^9 \text{ cm}^{-3}$, and the ambient temperature around 100 eV. The Alfv'en speed is $V_A \simeq 7 \times 10^8 \,\mathrm{cm\,s^{-1}}$, so V_A is comparable with the thermal speed of the electrons. The energy increments are of the order of $(\delta W/W) \approx (V_A/c)^2 \sim 10^{-4}$ (see equation 4), and the length L of the simulation box is 10^{10} cm. When not stated otherwise, we consider the grid to be open, i.e. particles can escape from the acceleration volume in case they reach any of the boundaries of the grid, at $t = t_{esc}$, which of course is different for each particle that escapes. We usually assume that only R = 10 per cent of the $N^3 =$ 601^3 grid points are active.



Figure 1. (a) Illustration of a trajectory of a typical particle (magneta line) inside the grid. Active points are represented by coherent structures, as commonly seen in large-scale MHD simulations. The particle starts at a random grid point, moves along a straight path on the grid till it meets an active point, and then it moves into a new random direction, and so on, until it eventually exits the simulation box. (b) Energy distribution at t = 0 s and t = 20 s (stabilized) for the electrons remaining inside the box. Stochastic Fermi acceleration from the large-scale magnetic disturbances formed inside a strongly turbulent plasma, as seen in the simulation box above, heats and accelerates the particles from the thermal pool (Pisokas et al. 2017).

Large-scale magnetic fluctuations are formed inside unstable complex magnetic topologies (see Fig. 1a). In several MHD numerical simulations, the formation of coherent structures (current sheets) is also present (see e.g. fig. 1 in Dmitruk et al. 2004 or fig. 1 in Isliker et al. 2017a). In this article, we exclude, for the sake of simplicity, the presence of unstable current sheets and their contribution to stochastic Fermi acceleration (Vlahos et al. 2016; Pisokas, Vlahos & Isliker 2018). A typical trajectory of a particle inside the simulation box is displayed in Fig. 1, the particle moves along the grid on straight lines until it encounters a scatterer, which affects its energy and direction of motion (see equation 4). The motion of the particle thus consists of the combined random walk in position and velocity space, with random gains and losses of energy, before exiting the simulation box. The mean-free path is $\lambda_{\rm sc} = \ell/R \simeq 2 \times 10^8$ cm, which coincides with the value estimated numerically by tracing particles inside the simulation box.

Using the numerical model presented above, Pisokas et al. (2017) showed that the model reproduces all the known analytical results of the stochastic Fermi acceleration. They also showed that the stochastic Fermi energization can reproduce the well-known energy distribution of astrophysical plasmas, where heating of the bulk of the plasma (here with energies E < 10 keV) and acceleration of the energetic particles (here for energies above 1 MeV; see Fig. 1b) takes place. The density of the scatterers (which is equivalent to the meanfree path λ_{sc} of the interaction of the particles with the scatterers) controls the evolution of the energetic particles and the heating. The energy distribution reaches an asymptotic state on a time-scale comparable to the acceleration time t_{acc} (see fig. 3 in Pisokas et al. 2017). Similar results have been reported on the interaction of ions with a spectrum of Alfv'en waves or of electrons with a spectrum of whistler waves (see Miller, Guessoum & Ramaty 1990). When the energy distribution reaches the asymptotic state, the mean escape time of the particles $t_{\rm esc} \sim 8$ s is close to the acceleration time $t_{\rm acc} \sim$ 9 s. The index of the power law of the particles in the energetic tail then agrees very well with the simple formula derived by Fermi, $k = 1 + t_{\rm acc}/t_{\rm esc} \sim 2$, see Fig. 1(b).

Parker & Tidman (1958), Ramaty (1979), and Blandford & Eichler (1987) analysed the interaction of electrons and ions with large amplitude magnetic perturbations, which they assumed to be hard spheres in order to be able to obtain analytical results. In the hard sphere approximation, the mean energy increase is

$$< W(t) > \sim t^2. \tag{12}$$

The energy distribution is obtained as an analytical solution of the FP equation. For particles with low energy ($W < mc^2$) it can be approximated with a Maxwellian distribution, and for the highenergy, relativistic particles ($W > mc^2$), the solution is

$$f(W) \sim W^{1/2 - (1/2)(9 + 12[t_{acc}/t_{esc}])^{1/2}}$$
 (13)

Thus also in the hard sphere approximation, the escape time t_{esc} , which is closely related with the transport of particles inside the acceleration volume, plays a key role in the estimation of the powerlaw index of the high-energy particles. For infinite acceleration regions and $t_{esc} \rightarrow \infty$, the energy distribution function is $f(w) \sim W^{-1}$ and for $t_{acc}/t_{esc} \sim 1$, it takes the form $f(W) \sim W^{-2}$. Therefore, the results reported by Fermi in his original article would have to be modified for non-relativistic or relativistic particles, if the analysis is based on the assumption of hard spheres, and t_{esc} should be estimated correctly from the dynamics inside the acceleration volume.

4 RESULTS

4.1 Spatial diffusion

We start our simulation by putting the particle with index j at a random position \mathbf{r}_{0j} in the 3D simulation box shown in Fig. 1(a). We follow the spatial evolution of the particle for n_j time-steps until its individual time $t_j^n = \sum_{i=1}^n \delta t_j^i$ (see Section 3) reaches t_{final} , which is chosen shorter than the mean time the particles need to escape from the acceleration volume (Pisokas et al. 2017). The particle positions are monitored at several hundred, pre-defined and equispaced monitoring times t^m (m = 1, ...M) in the interval [0, t_{final}], such that all particles are kept track of at equal times. The particle reaches the position $\mathbf{r}_j^m = \mathbf{r}_j(t^m)$ at time t^m and its displacement from its initial position is $\Delta \mathbf{r}_j^m = \mathbf{r}_j^m - \mathbf{r}_{0j}$. We collect the \mathbf{r}_j^m for



Figure 2. (a) The mean square displacement of the particles as a function of time, for the classical random walk without energization of the particles. The power-law fit has a slope equal to one. (b) The diffusion coefficient D_{rr} as a function of time.

 N_p particles and we estimate the mean square displacement as

$$< (\Delta r^m)^2 > = \frac{1}{N_p} \sum_{j=1}^{j=N_p} (\Delta r_j^m)^2.$$

The typical number of test particles used are several hundreds of thousands for all the simulations reported in this article.

4.1.1 Normal transport

As a consistency test, we assume here that the particles diffuse inside the simulation box without exchanging energy with the scatterers, so that their motion is a classical random walk and their transport properties have been discussed already (see equation 2). We plot in Fig. 2(a) the mean square displacement as a function of time. The slope of the power-law fit is indeed one ($a_r = 1$), as is expected for normal transport (equation 2).

From the same data, we can also estimate the diffusion coefficient AUTHORS:Please change index n with m

$$D_{rr} = \frac{1}{2} \frac{\langle (\Delta r^m)^2 \rangle}{t},$$
(14)



Figure 3. (a) Mean square displacement of the accelerated electrons, the index a_r is 1.6 for $\lambda_{sc} \sim 2 \times 10^8$ cm. (b) The index a_r as a function of λ_{sc} . (c) The index a_r as a function of the energy at final time or the energy with which the electrons escape from the acceleration volume, for $\lambda_{sc} \sim 1.7 \times 10^8$ cm.

see Fig. 2(b). The value of D_{rr} can also be estimated from the relation $D_{rr} \sim 3\lambda_{sc} \cdot v_{the} \sim 10^{17} \text{cm}^2 \text{ s}^{-1}$ (see equation 8 in Vlahos et al. 2008) for a classical random walk, which agrees very well with the simulation results in Fig. 2(b).

4.1.2 Anomalous transport

We now turn to the transport properties of the electrons energized inside the simulation volume, with the set-up presented above, and assuming that the particles are interacting with active scatterers that realize the stochastic Fermi process. The electrons thus gain or lose energy stochastically, following equation (4). The mean square displacement as a function of time for a typical value of λ_{sc} is shown in Fig. 3(a), it obviously follows equation (3), with power-law index $a_r \sim 1.41$ for $\lambda_{sc} \sim 2 \times 10^8$ cm, diffusion thus is clearly anomalous.

In Fig. 3(b), we show the index a_r as a function of λ_{sc} for typical values of the latter for the solar corona (Kontar et al. 2017). We conclude from the relation of a_r with λ_{sc} that electrons diffuse faster inside the acceleration volume and escape from the acceleration volume in shorter times when the mean-free path λ_{sc} is smaller. The superdiffusive characteristics of the electrons are related with the fact that acceleration and spatial transport are coupled (Bouchet et al. 2004), which is a rather large departure from the picture of anomalous transport of particles with constant velocity, discussed earlier in Section 2 (see the also the review Metzler & Klafter 2000). In other words, there are no spatial Levy flights involved in the superdiffusive spatial transport.

The degree of energization of the test particles depends strongly on their trapping inside the turbulent volume. To illustrate this, we consider the relation between the spatial mean square displacement and its characteristic scaling index a_r with the energy at final time or the energy with which the electrons escape from the acceleration volume. We divide the particles according to their final or escape energy into (logarithmically equispaced) bins, and the index a_r is computed separately for the particles belonging to each bin, using information from their travel history from t = 0 up to $t_{\rm esc} \sim t_{\rm final} \sim$ 10 s. Fig. 3(c) shows the scaling index a_r as a function of the final or escape energy. Electrons with energy $E < 10^4$ keV are transported normally $(a_r \sim 1)$ inside the acceleration volume and can be studied with the FP equation. The particles in the high-energy tail (E > 1)MeV), on the other hand, move in a superdiffusive way, with $a_r \sim$ 1.6 (see Fig. 3c). The electrons that escape with energies between 10^4 keV and 1 MeV are gradually becoming superdiffusive and a_r increases linearly with the escape energy from 1 to 1.6.

The waiting time probability distribution $P(\Delta t)$ of the time intervals Δt in between collisions of the particles with the scattering centres is an important parameter of the interaction of the particles with the large-scale magnetic disturbances. If the scattering centres are passive and the particles execute a classical random walk with constant speed before exiting the simulation box, we expect the waiting time probability distribution to be of exponential shape

$$P(\Delta t) = a \mathrm{e}^{-a(\Delta t - t_0)} \tag{15}$$

as long as the scatterers are uniformly distributed as in our set-up.

Here $1/a \approx \lambda_{sc}/v_{th}$ is the mean time between collisions with the scatterers, with v_{th} the thermal velocity of the initially injected Maxwellian distribution, and $t_0 = \ell/v_{th}$ is the smallest possible waiting time (ℓ is the grid spacing).

From the parameters used in the numerical simulations, we can estimate $1/a \approx \lambda_{sc}/v_{th} = 2 \times 10^8 \text{cm}/4 \times 10^8 \text{cm} \text{s}^{-1} \approx 0.5$ s and $t_0 = \ell/v_{\rm th} \approx 0.04$ s. In Fig. 4(a), we show $P(\Delta t)$ as a function of the waiting time for the case of passive scatterers, and the distribution agrees very well with equation (15) for the case where all particles have the same velocity (equal to the thermal velocity). An exponential fit yields $a \sim 1.7 \,\mathrm{s}^{-1}$, a value close to the estimate based on the model parameters. For the case where the particles have random (Maxwellian) velocity and still interact with passive scatterers (Fig. 4a), we find a clear deviation from the exponential shape, the distribution decays slower than exponential. Thus, the just velocity-wise in-homogeneous random walk already shows increased dynamic complexity. Fig. 4(b) shows $P(\Delta t)$ for the case of active scatterers, the distribution now exhibits a double power law, with index 1.5 for the intermediate waiting times and index 0.7 for the large waiting times. We note that if we would prescribe this kind of waiting time distribution and the particles would move with constant velocity, then the resulting transport would be of subdiffusive nature. In this sense, we must consider



Figure 4. (a) The probability distribution $P(\Delta t)$ of the waiting times between collisions of the particles with passive scatterers, for the case with random (Maxwellian) velocities and for the case with equal velocity for all particles (equal to the thermal velocity). (b) Waiting time distribution $P(\Delta t)$ for the interaction with active scatterers (stochastic Fermi acceleration).

that the power-law shaped waiting time distribution is an indication of the complexity that is caused by the synergy of spatial and active energy transport inside the stochastic Fermi accelerator. Our result also clearly departs from the waiting time distribution $P(\Delta t)$ in the work of Bouchet et al. (2004), who present an analytical model of stochastic Fermi acceleration and who also find that transport is clearly anomalous, even though they actually prescribe a waiting time distribution with an exponential tail for their results to hold.

Keeping the set-up used above with open boundary conditions, we now impose periodic boundary conditions, i.e. when an electron reaches any of the boundaries of the simulation box it re-enters the box from the opposite boundary. In this case, we can distinguish two parts in the evolution of the mean square displacement: (i) A transient phase, lasting 100 s (for plasma parameters related to the low solar corona, as before), during which $a_r \sim 1.8$ for $\lambda_{sc} \sim 3 \times 10^8$ cm (see Fig. 5). (ii) A longer and asymptotic phase, where the mean square displacement shows the scaling of normal diffusion.

It follows that in the periodic case, stochastic Fermi acceleration asymptotically attains Gaussian statistics for the probability distribution of the position of the particles, and the FP transport equation can be expected to describe well the spatial evolution of the particle distribution. The asymptotic power-law index $a_r = 1$ of the mean square displacement is in agreement with the prediction of equation (13) when t_{esc} practically is infinity, as it holds for periodic systems (Parker & Tidman 1958; Ramaty 1979).

Our analysis so far was concentrated on the heating and acceleration of electrons. The transport properties of ions are very similar with the ones reported here for electrons when λ_{sc} is the same.



Figure 5. The mean square displacement as a function of time, for the case of periodic boundary conditions, with two power-law fits, one for t < 100 s with $a_r \approx 1.8$, and one for t > 100 s with $a_r \approx 1.0$.



Figure 6. (a) The mean square displacement as a function of time for ions, together with a power-law fit. (b) The index a_r as a function of λ_{sc} .

In the case of open boundary conditions, there are no significant differences from the behaviour of the electrons, apart from the fact that the required time needed for the energy distribution to reach the asymptotic state is much longer. The spatial diffusion process is superdiffusive (see Fig. 6a), and the index a_r decreases when the mean-free path of the ions λ_{sc} become larger and approaches 1 when λ_{sc} approaches *L*, the size of the acceleration volume, the ions thus also diffuse and escape faster as λ_{sc} becomes smaller (see Fig. 6b). The characteristics of a_r as a function of the final or escape energy of the ions are also similar with the ones reported for the electrons.

4.2 Energy transport

The energy transport is closely related with the spatial transport when the particles are inside a finite size stochastic Fermi accelerator. The interaction of the particle j with an active scatterer renews its energy

$$W_i^{n+1} = W_i^n + \delta W_i^n$$

where δW_j^n is given by equation (4), and *n* counts the number of energization events. For the mean square displacement, we use the same set of pre-defined monitoring times t^m as described in Section 4.1 and keep track of the energies W_j^m at these times, $W_j^m = W_j(t^m)$, so that the mean is evaluated at equal times for all particles. We then define $\Delta W_j^m = (W_j^m - W_j^0)$, the energy displacement from the energy with which the particle was initially injected (W_j^0) into the acceleration volume. The mean displacement of the energy is defined through the relation

$$<\Delta W>(t^m)\equiv<\Delta W^m>=rac{1}{N_p}\sum_{j=1}^{j=N_p}\Delta W_j^m.$$
 (16)

and the mean square displacement is given as

$$< (\Delta W)^2 > (t^m) \equiv < (\Delta W^m)^2 > = \frac{1}{N_p} \sum_{j=1}^{j=N_p} (\Delta W_j^m)^2.$$
 (17)

The coefficients of the FP equation in energy space would be

$$F = \frac{\langle \Delta W^m \rangle}{\Delta t} \tag{18}$$

for the convective term (systematic acceleration) and

$$D = \frac{\langle (\Delta W^m)^2 \rangle}{2\Delta t} \tag{19}$$

for the diffusive term (stochastic acceleration).

Assuming that the mean displacement of the energy in general can be expressed as $\langle \Delta W \rangle (t) = D_W t^{a_W}$, we estimate a_W from the slope of the mean energy displacement as a function of time in logarithmic representation. In Fig. 7(a), we show $\langle \Delta W \rangle$ as a function of time, the mean displacement indeed shows a power-law scaling, and a power-law fit yields $a_W \sim 1.64$ for $\lambda_{sc} \sim 2 \times 10^8$ cm. Fig. 7(b) presents a_W as a function of λ_{sc} , the mean displacement of the particles in energy becomes larger as λ_{sc} becomes smaller, i.e. the convective (systematic) type of motion gets enhanced. In Fig. 7(c), we explore a_W as a function of the final energy or the energy with which the particles escape from the acceleration volume. For the electrons with energy smaller than 10 keV the convective transport is much reduced, in contrast to the high-energy particles, where the scaling index reaches an asymptotic value close to $a_W \sim 2.5$. The convective transport for energies between 10 keV and 1 MeV is changing linearly with the energy from $a_W \sim 0.4$ to $a_W \sim 2.5$.

We now turn to the mean square displacement in energy, which can generally be expected to have the functional form $< (\Delta W)^2 >$ $(t) = D_{W^2}t^{a_{W^2}}$. Fig. 8(a) shows $<(\Delta W)^2 >$ as a function of time, and by a power-law fit we find $a_{W^2} \sim 3.52$ for $\lambda_{sc} \sim 2 \times 10^8$ cm. Transport in energy inside the stochastic Fermi accelerator is also superdiffusive. In Fig. 8(b), we show a_{W^2} as a function of λ_{sc} , diffusion of particles in energy becomes faster as λ_{sc} becomes smaller and the acceleration time also gets shorter (see equation 6). In Fig. 8(c), we show a_{W^2} as a function of the final energy or the energy with which the particles escape from the acceleration volume. For the electrons with energy smaller than 10 keV the transport is normal, and for the high-energy particles it is



Figure 7. (a) The mean displacement in energy of the electrons as a function of time, together with a power-law fit. The slope of the power-law fit is $a_W \sim 1.64$ for $\lambda_{sc} \sim 2 \times 10^8$ cm. (b) The index a_W as a function of λ_{sc} . (c) The scaling index a_W as a function of the final energy or the energy with which the electrons escape from the acceleration volume.

superdiffusive, the scaling index reaches an asymptotic value close to $a_{W^2} \sim 5$. The transport for energies between 10 keV and 1 MeV changes linearly with the energy from normal to superdiffusive.

In order to compare the importance of convection (*F*) and diffusion (*D*) in an FP equation, one actually has to compare τF and $\sqrt{2\tau D}$, with τ a small time-step, of the order of the mean waiting time. From Figs 7 and 8, it then follows that convection and diffusion are of rather similar importance for the dynamics in energy space. Convective effects must be attributed to the fact that Fermi acceleration is slightly biased towards increasing the energies rather than decreasing them. Given that the transport property of the low-energy (heated) particles is normal, and it is anomalous for the high-energy particles, another important result from this section is that the FP equation is the proper transport equation for the evolution of the low-energy particles, while it clearly is an inappropriate tool for modelling the dynamic evolution of the high-energy particles.



Figure 8. (a) The mean square displacement in energy for electrons as a function of time. The index of the power-law fit is $a_{W^2} \sim 3.52$ for $\lambda_{sc} \sim 2 \times 10^8$ cm. (b) The index a_{W^2} as a function of λ_{sc} . (c) The scaling index a_{W^2} as a function of the final energy or the energy with which the electrons escape from the acceleration volume.

5 DISCUSSION AND SUMMARY

For several decades, stochastic Fermi acceleration (or second-order acceleration or stochastic turbulent acceleration) was analysed, almost exclusively, with the use of the QL transport equation in energy (Achterberg 1981; Miller et al. 1990; Melrose 2009; Petrosian 2012). The time particles remain inside the acceleration volume, $t_{\rm esc}$, was never calculated precisely, and it was used as a free parameter. In many astrophysical and space applications, stochastic Fermi acceleration was excluded as a potential acceleration as 'weak and second-order process' compared to shock acceleration, which was named a 'first-order process'. We have already outlined in the introduction, the weaknesses of the QL approach and the deficiency of the weak turbulence theory to accelerate electrons and ions efficiently. We believe that the ideas put forward by Fermi in his article in 1949 have nothing to do with the results derived

from the QL transport equation, since Fermi was referring to largescale magnetic disturbances ('magnetic clouds') and not to weak turbulence and wave-particle interactions (Kulsrud & Ferrari 1971).

In a recent article by Pisokas et al. (2017), we pose the question: What happens to stochastic Fermi acceleration in a strongly turbulent environment, where the magnetic fluctuations, serving as scatterers, are very large and their interaction with particles follows the formalism proposed initially by Fermi (Fermi 1949).

In this article, we have shown that the spatial and energy transport of the high-energy particles inside the stochastic Fermi accelerator are both superdiffusive, and the time the high-energy particles need to escape from the acceleration volume is correlated with the meanfree path of the particles between the scatterers. On the other hand, the relation between the transport properties of particles in space and energy plays a very crucial role for the power-law index of the high-energy tail and generally for the energy distribution inside a finite and impulsive accelerator.

Our main results in this article are:

(i) The spatial transport of high-energy electrons (higher than 1 MeV) inside a finite size stochastic Fermi accelerator is superdiffusive with $a_r \sim 1.6$, while the transport of heated low-energy (smaller than 10 keV) particles is normal.

(ii) The transport of particle depends on the mean-free path λ_{sc} . As λ_{sc} increases, the interaction of the particles with the large amplitude magnetic fluctuations becomes weaker and the transport properties tend asymptotically to normal diffusion. The escape time t_{esc} is linearly related with λ_{sc} , i.e. the smaller λ_{sc} the faster the particles will escape from the acceleration volume.

(iii) The probability distribution of the waiting times between subsequent collisions has a double power-law tail, with index 1.5 for the intermediate waiting times and index 0.7 for the large waiting times.

(iv) In a periodic simulation box, the spatial transport properties of the particles tend to normal transport as time increases (for the solar corona the characteristic time is higher than 100 s for $\lambda_{sc} \sim 3 \times 10^8$ cm).

(v) The scaling index a_W of the mean displacement in energy is linearly dependent on the mean-free path λ_{sc} . The mean displacement in energy becomes larger as λ_{sc} decreases, i.e. convective or systematic increase in energy gets enhanced.

(vi) The ions have very similar transport characteristics with the electrons, just on a lower time-scale.

(vii) The mean square displacement in energy is superdiffusive for the high-energy particles and normal for the heated low-energy particles. The scaling index a_{W^2} depends linearly on the mean square displacement λ_{sc} , the smaller λ_{sc} the faster is transport in energy. This result also agrees very well with equation (6).

(viii) The use of the FP equation for the study of the spatial and energy transport of the high-energy particles is inappropriate, but it is valid for modelling the heating of the low-energy particles or for long lasting interactions in periodic systems (with infinite escape time).

The astrophysical implications from our analysis are several.

(i) Stochastic Fermi acceleration has been labelled in most space and astrophysical studies as a 'second-order' and 'weak' acceleration process. Returning to the initial ideas proposed by Fermi for the stochastic acceleration, and given the results reported in this article on the superdiffusion of high-energy electrons and ions in energy space, we conclude that stochastic Fermi acceleration can be highly efficient and the acceleration time is related with the compactness of the scatterers.

(ii) The role of stochastic Fermi processes in the heating of plasmas has been ignored.

(iii) The second important criticism on stochastic Fermi accelerators is that the index of the high-energy particles is not constant and not always close to 2, as most observations suggest, since it depends on the escape time t_{esc} , and, in the weak turbulence theory, on the characteristics of the spectrum of the plasma waves accelerating the particles. This result is also misleading, since the transport of the high-energy particles analysed in this articles is superdiffusive and t_{esc} is closely related with λ_{sc} . Therefore, the acceleration time and the escape time are correlated through λ_{sc} . Pisokas et al. (2017), using reasonable values for the low solar corona for λ_{sc} , show that the power-law index of the high-energy particles remains close to 2.

(iv) The FP transport equation for the evolution of the energy distributions was extensively used in the space and astrophysical plasma literature for the analysis of the interaction of particles with plasma waves. We conclude in this article that the transport is non-Gaussian for the interaction of particles with large amplitude magnetic disturbances, and both the spatial and energy transport must be re-examined using a transport framework different from the FP approach (see e.g. Metzler & Klafter 2004).

In Isliker et al. (2017b), we have analysed *systematic* (first-order) Fermi acceleration, in the same frame of a lattice model approach as used here. We there have explicitly shown that the FP approach fails, and only a fractional transport equation is adequate and successful in modelling the transport in energy space (spatial transport was not analysed in Isliker et al. 2017b). Given the anomalous transport properties of stochastic Fermi acceleration analysed here (see e.g. Fig. 8), we would expect that a fractional transport equation similar to that in Isliker et al. (2017a, b) would be appropriate also for the case of second-order Fermi acceleration in what the energy transport is concerned. Still missing is a combined modelling framework for the doubly anomalous transport in position and energy space.

(v) Perri & Zimbardo (2012) discuss the transport of particles upstream of a shock assuming that the turbulence upstream does not affect the energetics of the particles. In this article, we show that superdiffusive characteristics of transport can be the result of stochastic Fermi acceleration in strong turbulence upstream (Zank et al. 2015; Garrel et al. 2018).

In strongly turbulent plasmas, large-scale magnetic disturbances during explosive or impulsive events are associated with coherent structures (unstable current sheets or shocks), which accelerate particles even more efficiently, being first-order processes (see Isliker et al. 2017a). In this article, we simplified the analysis by isolating the stochastic Fermi acceleration from the effects of the coherent structures, avoiding in this way the complexity of the synergy of two processes (Comisso & Sironi 2018, 2019; Pisokas et al. 2018). Strongly turbulent plasmas combine all the well-known accelerators studied separately in the past (second-order Fermi, unstable current sheets and turbulent shocks; see Karimabadi et al. 2013, 2014). A systematic study of the transport properties of highenergy particles in these mixed environments has only recently been started (see Vlahos et al. 2004; Matsumoto et al. 2015; Zank et al. 2015; Vlahos et al. 2016; Comisso & Sironi 2018, 2019; Garrel et al. 2018; Pisokas et al. 2018).

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