

Applications of Large Eddy Simulation methods to gyrokinetic turbulence

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The Large Eddy Simulation (LES) approach - solving numerically the large scales of a turbulent system and accounting for the small-scale influence through a model - is applied to nonlinear gyrokinetic systems that are driven by a number of different microinstabilities. Comparisons between modeled, lower resolution, and higher resolution simulations are performed for an experimental measurable quantity, the electron density fluctuation spectrum. Moreover, the validation and applicability of LES is demonstrated through a series of diagnostics based on the free energetics of the system.

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I. INTRODUCTION

Large Eddy Simulation (LES) methods were first introduced within the computational fluid dynamics community¹ in an attempt to focus on the large scales of a turbulent flow, which often contain the information of interest for practical applications, using the least possible amount of computational resources. Simpler versions of LES methods are based on a phenomenological approach to turbulence, which, for a fluid described by the Navier-Stokes equations, can be understood in terms of two concepts, scale separation and redistribution of energy between scales. Indeed, the Reynolds number, which is used to characterize different flow regimes of a fluid, measures the ratio between the forcing scale and the dissipation scale in the system. For weakly turbulent flows (or equivalently for low Reynolds numbers), the small separation of scales implies the excitation of only a few degrees of freedom. As one approaches a fully developed turbulent state, the scale separation increases, and more degrees of freedom become excited. As the forcing and dissipation start to act primarily at completely different scales, an inertial range develops to bridge the two effects. The inertial range, dynamically dominated by the nonlinear couplings, serves to redistribute the energy from the large forcing scale to the small dissipation scale, in a process known as a cascade². This redistribution of energy is expected to have a universal character and leads to the development of power laws for certain spectral quantities. As such, accurately recovering the correct power law exponents is a sign of an adequately resolved simulation.

Turbulence in magnetized plasmas is more complex than fluid turbulence since it involves multi-field dynamics, important kinetic effects, and the possibility to dissipate energy at different (phase space) scales. Moreover, plasma turbulence can be driven by a large variety of different microinstabilities

- including ion temperature gradient (ITG) modes, trapped electron modes (TEMs), and electron temperature gradient (ETG) modes, which may differ significantly in their characteristic spatio-temporal scales as well as in their fluctuation power law spectra. In particular, in the context of plasma turbulence described by the gyrokinetic (GK) model³⁻⁵, several theories try to explain the power laws found in experiments or in direct numerical simulations by means of concepts like nonlinear phase mixing^{6,7}, critical balance⁸, or damped eigenmodes⁹. For this reason, a correct identification of the power law exponents is important for the understanding of the underlying physics and useful for providing constraints for simple physical models. From an experimental point of view, the knowledge of characteristic scales and wavenumber spectra is important for the clear identification of the different turbulence regimes, in which various microinstabilities can affect the confinement of particles and heat in different ways¹⁰. With the recent improvements in fluctuation diagnostics, such as the new Doppler reflectometer in the ASDEX Upgrade tokamak¹¹, it is now possible to measure turbulence characteristics with higher precision, allowing for better direct comparisons between the experimental data and the results of nonlinear gyrokinetic simulations.

Unfortunately, within the context of nonlinear gyrokinetics, ensuring that all of the relevant phase-space dissipation mechanisms are adequately resolved (so that the fluctuation statistics are adequately described) can be very expensive from a computational point of view¹². Hence, the LES technique used for simulation fluid turbulence has been applied to plasma turbulence, first using simpler shearing-rate based sub-grid models in gyrofluid¹³ and gyrokinetic¹⁴ simulations, and recently using more advanced dynamic sub-grid models^{15,16}. The same ideas, to resolve the largest scales in the system and model the influence of small ones, are applied to the gyrokinetic equations and give rise to the Gyrokinetic Large Eddy Simulation (GyroLES) approach. Previous efforts in this new field were focused on saving the computational time as much as possible, while having the most accurate possible results in

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terms of global transport quantities, such as cross-field heat and particle fluxes. This requires retaining only relatively few scales of motion, and simulations speedups by factors of 20 – 30 have been achieved. The present paper is not aimed at calculating only global transport quantities at minimal computational cost, but to demonstrate that the GyroLES approach, using a similar resolution that is used in present simulations, yields more accurate power law exponents for different quantities and for a wide range of parameters and instabilities, at a lower computational cost. In particular, we will show that to have at least the same accuracy in the resulting power laws as in a GyroLES simulation, one will need to perform a simulation with at least two times more resolution in both perpendicular spatial directions.

The remainder of this paper is organized as follows. The gyrokinetic model is briefly introduced in Sec. II, and the GyroLES approach is summarized in Sec. III. Numerical results are then presented in Sec. IV. Here, a description of the different cases and instabilities is provided, followed by an analysis of the performance of the GyroLES methods. The latter will be focused on an experimentally accessible quantity, namely the electron density fluctuation spectrum. Moreover, in order to better understand the range of applicability of the GyroLES approach for the different cases, several diagnostics based on the free energy of the system will be introduced and analyzed in detail in the last part of this section. Finally, conclusions and discussions of the main results will be given.

II. GYROKINETIC MODEL

The simulations presented below are performed with the gyrokinetic code GENE¹⁷. It integrates in time (t) the non-linear gyrokinetic equations on a fixed grid that discretizes the five-dimensional phase space. GENE uses a field aligned coordinate system that exploits the scale separation between the perpendicular and parallel directions. The real space non-orthogonal coordinates are represented by $\{x, y, z\}$, where z is the coordinate along the magnetic field line, while the radial coordinate x and the binormal coordinate y are orthogonal to the magnetic field. The velocity space coordinates $\{v_{\parallel}, \mu\}$ are, respectively, the velocity parallel to the magnetic field and the magnetic moment. For simplicity, we restrict ourselves here to the local approximation, although GENE can also be used as a global code¹⁸. In this case, the coordinates perpendicular to the magnetic field are Fourier transformed $(x, y) \rightarrow (k_x, k_y)$. Symbolically, the evolution equation for the distribution function $g_j = g_j(k_x, k_y, z, v_{\parallel}, \mu, t)$ can be expressed as

$$\frac{\partial g_j}{\partial t} = L[g_j] + D[g_j] + N[g_j]. \quad (1)$$

Typically, the index j takes two values, $j = i$ for the ions and $j = e$ for the electrons.

The first term in Eq. (1) is a linear term which can be split into three contributions, $L[g_j] = G[g_j] + L_C[g_j] + L_{\parallel}[g_j]$. Here, G represents the influence of the density and temperature gradients, L_C describes effects due to magnetic curvature, and L_{\parallel} contain the parallel dynamics involving magnetic

trapping as well as linear Landau damping. The next term in Eq. (1) is the dissipation term, $D[g_j]$, which is represented by a Landau-Boltzmann collision operator or by fourth-order hyper diffusion operators in the collisionless case (more details are given in the next section). Finally, $N[g_j]$ is the nonlinear term be expressed in real space (x, y) in terms of Poisson brackets:

$$N[g_j] = -[\chi_j, h_j]_{x,y} = \frac{\partial \chi_j}{\partial y} \frac{\partial h_j}{\partial x} - \frac{\partial \chi_j}{\partial x} \frac{\partial h_j}{\partial y}, \quad (2)$$

where h_j is the non-adiabatic part of the perturbed distribution functions and χ_j are the electrodynamic field contributions, obtained self-consistently from the Poisson-Ampère laws for gyrokinetics. The nonlinear term has the fundamental role of coupling different scales in phase space and leads to an effective coupling of perpendicular k_x and k_y modes. For the explicit form of the linear terms see Ref. [19], although the knowledge of their explicit form is not necessary for the understanding of the current paper.

III. THE FILTERED GYROKINETIC EQUATION

Large Eddy Simulations for gyrokinetics require a separation between the large (resolved) and the small scales in the system. As we are only interested in a separation of perpendicular spatial scales, characterized by modes in k space, we introduce a cutoff wavenumber k_c that separates the two. Omitting the functional dependences of the terms and the distribution function's species label, the evolution equation for the large scales ($|k_x| \leq k_c$ and $|k_y| \leq k_c$) can be written as

$$\frac{\partial}{\partial t} g_{k|k_c}^< = L_{k|k_c}^< + D_{k|k_c}^< + N_{k|k_c}^< + N_{k|k_c}^{SGS}, \quad (3)$$

where the subscript notation $k|k_c$ indicates that the k dependent terms have been parametrized with respect to the cutoff wavenumber k_c . In addition, the $<$ superscript notation indicates that in computing the large scale terms, only modes satisfying the inequality $k \leq k_c$ are retained. This is always true for the linear terms. However, as the nonlinear term N_k for the large scales ($k \leq k_c$) mixes the large and the small scales, we split its contribution into two parts. One part, $N_{k|k_c}^<$, that contains interactions occurring only between large scale modes and another part that takes into account the interactions with the small sub-grid scale (SGS) modes, for which $k > k_c$. The sub-grid term $N_{k|k_c}^{SGS}$ is the only term that cannot be expressed as a function of solely the resolved scales $k \leq k_c$. Taking into account that Eq. (3) is just the GK equation rewritten for modes $k < k_c$, the sub-grid term is simply

$$N_{k|k_c}^{SGS} = N_k - N_{k|k_c}^<. \quad (4)$$

The GyroLES approach consists in replacing this SGS term by a good model, which only depends on the resolved quantities $g_{k|k_c}^<$ and a set of free parameters $a = \{a_1, a_2, \dots\}$,

$$N_{k|k_c}^{SGS} \approx M_{k|k_c}^<[a]. \quad (5)$$

The free parameters must then be calibrated appropriately.

Through a process known as the *dynamic procedure*, it is possible to calibrate automatically all free parameters in the model. In a first step, the procedure requires the introduction of an additional cutoff scale k_t , with $k_t < k_c$, known as a test-scale. The resulting test-filtered gyrokinetic equation,

$$\frac{\partial}{\partial t} g_{k|k_t}^< = L_{k|k_t}^< + D_{k|k_t}^< + N_{k|k_t}^< + N_{k|k_t, k_c}^{STS} + M_{k|k_c}^< [a], \quad (6)$$

contain the sub-test-scales (STS) term, parametrized in respect to k_t and k_c . Since $N_{k|k_t, k_c}^{STS} = N_{k|k_c}^< - N_{k|k_t}^<$, it can be computed explicitly as resolved scales up to k_c are known. In a second step, a cutoff wavenumber k_t is introduced directly into Eq. (1). This yields (for scales $k < k_t$)

$$\begin{aligned} \frac{\partial}{\partial t} g_{k|k_t}^< &= L_{k|k_t}^< + D_{k|k_t}^< + N_{k|k_t}^< + N_{k|k_t}^{SGS} \\ &= L_{k|k_t}^< + D_{k|k_t}^< + N_{k|k_t}^< + M_{k|k_t}^< [a], \quad (7) \end{aligned}$$

where in the last equation, the sub-grid term has been replaced by the same model as in Eq. (6). Although the same free parameters $\{a_1, a_2, \dots\}$ are used, this model acts now in a more limited simulation ($k_t < k_c$), and therefore, its amplitudes will be adjusted accordingly. Equating Eqs. (6) and (7), up to test scales $k \leq k_t$ yields an identity for the sub-test-scale term and the model, known as the Germano identity^{20,21},

$$N_{k|k_t, k_c}^{STS} + M_{k|k_c}^< [a] - M_{k|k_t}^< [a] = 0 \quad \text{for } k \leq k_t. \quad (8)$$

The unknowns of the Germano identity, i.e., the free parameters of the model $\{a_1, a_2, \dots\}$, can then be calculated by an optimization of this difference with respect to the unknowns (least squares method),

$$\frac{\partial}{\partial \{a_1, a_2, \dots\}} \left\langle \left(N_{k|k_t, k_c}^{STS} + M_{k|k_c}^< [a] - M_{k|k_t}^< [a] \right)^2 \right\rangle_{\Lambda} = 0, \quad (9)$$

where $\langle \dots \rangle_{\Lambda}$ represents phase space (Λ) integration. Note that, if more than one kinetic species are being solved, the resulting parameters of the model are species dependent. This allows one to separately model the different species in the system.

The numerical resolution used in a code is indicated by introducing a cutoff filter denoted by $\overline{\overline{\overline{\cdot}}}$, with a characteristic length $\bar{\ell} = 1/k_c$. This filter sets to zero the smallest scales in the distribution function g_j , characterized by all modes larger than $k > k_c$. In particular, for the GK equation solved by the GENE code, the cutoff k_c is performed in the perpendicular plane and the filter is implemented numerically by reducing the number of grid points in (k_x, k_y) space.

In previous works^{15,16}, a hyper-diffusion model for the sub-grid term was proposed,

$$M[\bar{g}, a_x, a_y] = -(a_x \bar{\ell}_x^{\alpha} (k_x \bar{\ell}_x)^n + a_y \bar{\ell}_y^{\alpha} (k_y \bar{\ell}_y)^n) \bar{h} \quad (10)$$

with $n = 4$. Here, $\bar{\ell}_x, \bar{\ell}_y$ represents the characteristic filter scale in the perpendicular directions, a_x, a_y are the free parameters, and \bar{h} is the non-adiabatic part of the perturbed distribution function. (As pointed out in Ref. [22], renormalized

damping models should only damp the non-adiabatic part of the distribution function. The adiabatic/Boltzmann part is already in a state of maximum entropy, so reducing it would reduce the entropy. Furthermore, the nonlinearity vanishes on the adiabatic part of the distribution function.) Note that the damping rate in each direction in the sub-grid term, $a_i \bar{\ell}_i^{\alpha}$, has units of $1/t$. In those previous works, we used a dimensional analysis based on the ‘‘free energy flux density’’ to fix the cutoff scale exponent, which gives $\alpha = 1/3$. However, here we will use a somewhat more conventional estimate based on the free energy flux and analogies to standard fluid turbulence, which leads to $\alpha = -2/3$. In the Kolmogorov picture of fluid turbulence, quantities at scale ℓ in the inertial range can depend only on the scale ℓ and on the energy flux ϵ (in a plasma, the related quantity is the free energy flux), which has units of $\epsilon \sim v_{\ell}^3/\ell$, where v_{ℓ}^2 is the energy per unit mass in eddies of scale ℓ . (See for example Sec. 7.2 of Ref. [23].) Dimensional analysis shows that if the damping rate $a_i \bar{\ell}_i^{\alpha}$ can depend only on these two parameters, $a_i \bar{\ell}_i^{\alpha} \sim \epsilon^{\beta} \bar{\ell}_i^{\gamma}$, then that means that $\alpha = \gamma = -2/3$, and $\beta = 1/3$, so that $a_i \sim \epsilon^{1/3}$. Physically, this scaling of the sub-grid model means that the damping rate scales with the eddy turnover rate, which increases at smaller scales like $\ell^{-2/3}$ in the inertial range.

This $\ell^{-2/3}$ scaling is tied to the inertial range energy spectrum of fluid turbulence of $E_k \sim k^{-5/3}$. However, there are additional parameters that may affect plasma turbulence so that different spectral slopes may be seen in different types of plasma turbulence (as we will see in this paper), and thus the optimal value of the scaling with ℓ might change. This is because of several factors, including the anisotropy and additional modes in plasmas. I.e., the energy cascade rate in the perpendicular directions can be affected by energy cascades to finer scales in the parallel direction, to finer scales in velocity space, and by coupling to modes at the same spatial scale that are Landau damped⁹. Also, the relation between the (free) energy flux and the eddy velocity spectrum in plasmas is not as straightforward as it is neutral fluids because of finite-Larmor-radius and other effects.

For cases where the coefficients a_i are fit (using the procedure defined below) with a test filter width that is a factor of 2 larger than the resolved scale, the new scaling of $M \sim a_i \bar{\ell}_i^{-2/3}$ would make M a factor of 2 larger, if the coefficient a_i was the same. In fact, because of anisotropies and nonlinearities in plasma dynamics, we have found that this change in the exponent of $\bar{\ell}$ causes a_i to also increase, so that the overall increase in the magnitude of sub-grid model damping rate can be a factor of ~ 5 larger in some cases. Our general experience is that this stronger value of sub-grid damping rate has made it more robust and effective. In general, it seems better if the coefficient of the sub-grid term is somewhat larger than optimal instead of too small. Because of the hyperdiffusion form $\sim k^4$ of the sub-grid term, if the damping rate is too strong at the grid scale $k \sim 1/\bar{\ell}$, it will be about right at a somewhat smaller value of k . But if the damping rate is too weak at the perpendicular grid scale, then there will be a bottleneck for energy cascade in the perpendicular direction, and energy transfers will instead be forced in the parallel direction or to other modes with stronger Landau

damping, so that the spectra are more strongly distorted.

The resulting filtered gyrokinetic equation solved in GENE then reads

$$\begin{aligned} \frac{\partial \bar{g}}{\partial t} &= L[\bar{g}] + D[\bar{g}] + N[\bar{g}] + N_{\bar{\ell}, \ell} \\ &= L[\bar{g}] + D[\bar{g}] + N[\bar{g}] + M[\bar{g}, a_x, a_y]. \end{aligned} \quad (11)$$

Here, $N_{\bar{\ell}, \ell}$ is the sub-grid term, which for clarity of the presentation, is represented by a notation that indicates the fact that this term contains the influence of both the resolved scales $\bar{\ell}$ and the sub-grid scales ℓ .

The parameters $\{a_x, a_y\}$ can now be calculated with the application of the dynamic procedure by introducing the additional test-filter denoted in the following by $\widehat{\cdot}$, with a characteristic length taken simply as $\widehat{\ell} = 2/k_c = 2\bar{\ell}$. The resulting optimization of the system of equations given by Eq. (9) yields

$$\begin{aligned} a_x &= \frac{1}{\gamma_x} \frac{\langle m_x N_{\widehat{\ell}, \bar{\ell}} \rangle_{\Lambda} \langle m_y^2 \rangle_{\Lambda} - \langle m_y N_{\widehat{\ell}, \bar{\ell}} \rangle_{\Lambda} \langle m_x m_y \rangle_{\Lambda}}{\langle m_x m_y \rangle_{\Lambda}^2 - \langle m_x^2 \rangle_{\Lambda} \langle m_y^2 \rangle_{\Lambda}} \\ a_y &= \frac{1}{\gamma_y} \frac{\langle m_y N_{\widehat{\ell}, \bar{\ell}} \rangle_{\Lambda} \langle m_x^2 \rangle_{\Lambda} - \langle m_x N_{\widehat{\ell}, \bar{\ell}} \rangle_{\Lambda} \langle m_y m_x \rangle_{\Lambda}}{\langle m_x m_y \rangle_{\Lambda}^2 - \langle m_x^2 \rangle_{\Lambda} \langle m_y^2 \rangle_{\Lambda}} \end{aligned} \quad (12)$$

where the quantities

$$m_x = k_x^n \widehat{h} \quad \text{and} \quad \gamma_x = 1 - \left(\frac{\bar{\ell}_x}{\widehat{\ell}_x} \right)^{n-2/3}, \quad (13)$$

$$m_y = k_y^n \widehat{h} \quad \text{and} \quad \gamma_y = 1 - \left(\frac{\bar{\ell}_y}{\widehat{\ell}_y} \right)^{n-2/3} \quad (14)$$

have been introduced to simplify the notation. Here, $N_{\widehat{\ell}, \bar{\ell}} = N[\bar{g}] - N[\widehat{g}]$ represents the sub-test-scale term that is known and can be calculated in a GyroLES simulation. In addition, the dissipative effect on the model is guaranteed by setting to zero any negative coefficient value¹⁶.

IV. NUMERICAL RESULTS

In the present section, numerical simulations of GK turbulence for different types of instabilities and scenarios, ranging from the well known Cyclone Base Case²⁸ to an experimental ASDEX Upgrade discharge, are performed. After introducing the simulation database for the runs considered, electron density fluctuation spectra will be shown for the different cases. Finally, several free energy studies will be presented in the last part of this section.

A. Simulation database

To analyze the usefulness of LES methods in numerical simulations, we look at different cases of GK turbulence,

| Name | \hat{s} | $\frac{R}{L_n}$ | $\frac{R}{L_{T_i}}$ | $\frac{R}{L_{T_e}}$ | grid ($x \times y$) | box size ($x \times y$) |
|-------------|-----------|-----------------|---------------------|---------------------|-----------------------|---------------------------|
| CBC-H-DNS | 0.8 | 2.2 | 6.9 | - | 128 × 64 | 125 × 125 |
| CBC-L-DNS | 0.8 | 2.2 | 6.9 | - | 64 × 32 | 125 × 125 |
| CBC-LES | 0.8 | 2.2 | 6.9 | - | 64 × 32 | 125 × 125 |
| ITG-H-DNS | 0.8 | 2.2 | 12.0 | - | 128 × 64 | 125 × 125 |
| ITG-L-DNS | 0.8 | 2.2 | 12.0 | - | 64 × 32 | 125 × 125 |
| ITG-LES | 0.8 | 2.2 | 12.0 | - | 64 × 32 | 125 × 125 |
| ETG-H-DNS | 0.1 | 2.2 | - | 6.9 | 128 × 128 | 200 × 125 |
| ETG-L-DNS | 0.1 | 2.2 | - | 6.9 | 64 × 64 | 200 × 125 |
| ETG-LES | 0.1 | 2.2 | - | 6.9 | 64 × 64 | 200 × 125 |
| TEM-H-DNS | 0.8 | 3.0 | 0.0 | 5.5 | 128 × 128 | 209 × 104 |
| TEM-L-DNS | 0.8 | 3.0 | 0.0 | 5.5 | 64 × 64 | 209 × 104 |
| TEM-LES | 0.8 | 3.0 | 0.0 | 5.5 | 64 × 64 | 209 × 104 |
| AUG-H-DNS | 1.6 | 0.5 | 5.1 | 5.1 | 128 × 128 | 149 × 124 |
| AUG-L-DNS | 1.6 | 0.5 | 5.1 | 5.1 | 64 × 64 | 149 × 124 |
| AUG-LES | 1.6 | 0.5 | 5.1 | 5.1 | 64 × 64 | 149 × 124 |
| AUG-L/2-DNS | 1.6 | 0.5 | 5.1 | 5.1 | 32 × 32 | 149 × 124 |
| AUG-LES/2 | 1.6 | 0.5 | 5.1 | 5.1 | 32 × 32 | 149 × 124 |

TABLE I. Main parameters for the different simulations. Horizontal lines separate the relevant sets of data, identified by the same prefix. The first set corresponds to the CBC. The second set uses the same parameters as the CBC, but with a higher temperature gradient. The third set corresponds to a typical ETG simulation. In this case, a lower magnetic shear respect to the CBC is used. The fourth set is used to study a pure TEM case where both ions and electrons are kinetic. Finally, the last set of parameters corresponds to a simulation of an ASDEX Upgrade discharge dominated by ITG. For every set of parameters, there is a H-DNS ("high resolution" Direct Numerical Simulation), a L-DNS ("low resolution" Direct Numerical Simulation) and a LES (Large Eddy Simulation). The last two cases use half of the resolution in each of the perpendicular directions. Only for the AUG case, two extra simulations with a fourth of the resolution are included.

driven by a wide range of instabilities and for different parameter scenarios. As the LES method employed here makes use of a hyper-diffusion model in the $\{x, y\}$ directions, we will look at different $\{x, y\}$ resolutions. Meanwhile, the same $\{16 \times 32 \times 8\}$ resolution is used in the $\{z \times v_{\parallel} \times \mu\}$ directions for all the cases except the TEM and AUG simulations which use $\{24 \times 32 \times 16\}$. All the simulations are done with hyperdiffusion terms in the z and v_{\parallel} directions given by,

$$D[g] = - \left(a_z \frac{\partial^4}{\partial z^4} + a_{v_{\parallel}} \frac{\partial^4}{\partial v_{\parallel}^4} \right) g. \quad (15)$$

These hyperdiffusion terms are necessary to stabilize spurious grid-size oscillations²⁹. For all the cases, the coefficients are set to $a_z = 1.0$ and $a_{v_{\parallel}} = 0.2$, since they have been shown to be well suited for a wide range of cases. Finally, for the AUG case, a linearized Landau-Boltzmann collision operator with energy and momentum conserving terms³⁰ and with a collision frequency taken from experimental data is also used.

Details of the different perpendicular resolutions and main parameters for the simulations considered can be found in Table I. The resolutions considered here are used extensively by

the fusion community, and for all the cases the turbulent (particle and heat) fluxes are properly resolved. In general, the lowest resolution is used as long as these global values are found to vary within 30%. As we will see during the next sections, this does not imply that the system is well resolved. For this reason, although in computational fluid dynamics the terminology Direct Numerical Simulations (DNS) is used to denote that all scales are being fully resolved, we will use DNS in its weak interpretation to denote that no additional sub-grid scale hyper-diffusion model is being used. In this sense, DNS runs should be seen as having varying degrees of incomplete resolution. For this purpose, we will label by L-DNS the low resolution DNS simulations and by H-DNS the high resolution DNS simulations. The runs for which the sub-grid scale terms are being modelled will be labeled as LES.

The first set of parameters corresponds to the Cyclone Base Case, commonly used for the study of ITG driven GK turbulence, and we label it CBC. In this study, the analysis is limited to the simple scenario of a single ion species and adiabatic electrons in the context of a large aspect-ratio, circular model equilibrium. The equilibrium magnetic configuration is characterized by a safety factor value of $q = 1.4$ and a magnetic shear value of $\hat{s} = 0.8$.

As a way to analyze the applicability of LES methods for even stronger turbulence regimes, in a second set of parameters we consider additional simulations with the same parameters as for the standard CBC case, but with a higher ion temperature gradient ($R/L_{T_i} = 12$). We designate this second set simply as ITG.

The third set is used for the study of a typical ETG driven turbulence, where the adiabatic ion approximation is used³¹. In this case, the LES model acts on the electrons. We will consider again a circular concentric geometry with $q = 1.4$ and $\hat{s} = 0.1$.

The fourth set (designated TEM) is inspired by experiments dominated by electron heating and rather cold ions, specific to turbulence driven by (collisionless) TEMs³². Here, both ion and electron dynamics are retained, which implies that the LES models and their coefficients calculated by the dynamic procedure are species-dependent. For simplicity, a circular concentric geometry is used with $q = 1.4$ and $\hat{s} = 0.8$. In order to study a pure TEM instability, R/L_{T_i} is set to 0, and the ratio between the electron and ion temperature is set to $T_e/T_i = 3$ which for these parameters eliminates the ETG instability. It should be noted that such a situation is by no means artificial, since a lot of experiments have been carried out with dominant central electron heating³³.

While the above "idealized" turbulence simulations have the great advantage of minimizing the degree of complexity in performing and analyzing the runs, they usually represent simplified situations which are, in general, of limited value for direct comparisons with experimental findings. For this reason, the last set applies the dynamic procedure to the study of turbulence for plasma conditions found in an H-mode ASDEX Upgrade tokamak discharge. The input profile and equilibrium are taken from the ASDEX Upgrade discharge #28245. This discharge is a Type-I edge localized (ELMy) H-mode with a plasma current of 0.6 MA and a toroidal magnetic field

of 2.3 T. The input neutral beam injection (NBI) was 2.5 MW and an electron cyclotron resonance heating (ECRH) was divided into four phases, where 0.0, 0.5, 1.2 and 1.8 MW were applied subsequently at intervals of 0.5 s. In the following, we will focus on the phase, where no ECRH is applied, which corresponds to a discharge time of 2.5 s - 3.0 s. Furthermore, the local simulations would be focused on the flux surface at $\rho_{tor} = 0.57$. In this case, previous linear gyrokinetic simulations³⁴ showed that ITG is the dominant instability. ETG is also present but its relative (to the ITG) amplitude is negligible. For this reason, although we will use both kinetic ions and electrons, we will only resolve scales in the ITG range. For this scenario, we use a realistic magnetic equilibrium geometry, taken from the TRACER-EFIT interface³⁵, with equilibrium parameters given as follows: $q = 2.8$ and $\hat{s} = 1.6$. A linearized Landau-Boltzmann collision operator ($\nu_{*,i} = 0.19$ and $\nu_{*,e} = 0.36$), the effect of $E \times B$ shear ($\gamma_E = 0.02 [c_s/a]$) and magnetic fluctuations ($\beta = 0.25\%$) are included.

B. Electron density fluctuation spectra

In the following, the assessment of LES methods compared to various DNS runs of different resolutions are shown for the electron density fluctuation spectra. In particular, the electron density fluctuation spectrum in the binormal direction $S(k_y) = \langle |\tilde{n}_e(k_x, k_y, z, t)|^2 \rangle_{k_x, z, t}$ as well as in the radial direction $S(k_x) = \langle |\tilde{n}_e(k_x, k_y, z, t)|^2 \rangle_{k_y, z, t}$ are plotted in Fig. 1. Here, $\langle \dots \rangle$ denotes averaging over quantities listed as indices and all spectra are normalized by their respective wavenumber integrated value $\langle |\tilde{n}_e(k_x, k_y, z, t)|^2 \rangle_{k_x, k_y, z, t}$. The wavenumbers are normalized in units of the dominant species gyroradius (ρ_i for ITG and ρ_e for ETG) for one kinetic species simulations, and in ρ_s units (ion gyroradius at electron temperature) in the case where two kinetic species are considered (TEM and AUG). Some general features are common to all data sets: the $S(k_y)$ spectra exhibit a maximum at $k_y \sim 0.1 - 0.2$ and the radial $S(k_x)$ spectra peak at wavenumbers close to zero. In both cases, a power law $S(k_{x,y}) \propto k_{x,y}^{-\alpha_{x,y}}$ for wavenumbers between $k_{x,y} \sim 0.3 - 1.0$ is observed. Although, a transition and a change of the power law is expected by several theories at $k_{x,y} > 1$ (see Ref. [7]), we will limit our study up to $k_{x,y} \sim 1$. Therefore, in the following comparisons of the spectra will be focus on the wavenumber range between $k_y \sim 0.3 - 0.9$, where a fit to the power law exponents is given for the LES simulations.

For the CBC set of parameters, a fit of spectra yields the power law exponents $\alpha_x = 2.3$ and $\alpha_y = 3.3$. In this case, the LES (in green) spectra match very well the H-DNS (in black) spectra in both $S(k_x)$ and $S(k_y)$. In contrast, L-DNS (in red) spectra get flattened at higher wavenumbers. For the higher temperature gradient ITG case, the fit exponents are $\alpha_x = 2.0$ and $\alpha_y = 2.6$. Regarding the $S(k_x)$ spectra, similar conclusions as in the CBC can be drawn. However, the $S(k_y)$ spectrum exhibits a bigger difference between the LES and H-DNS simulations. In fact, the H-DNS spectra seem to present a flattening of the spectra at the highest wavenumbers. We an-

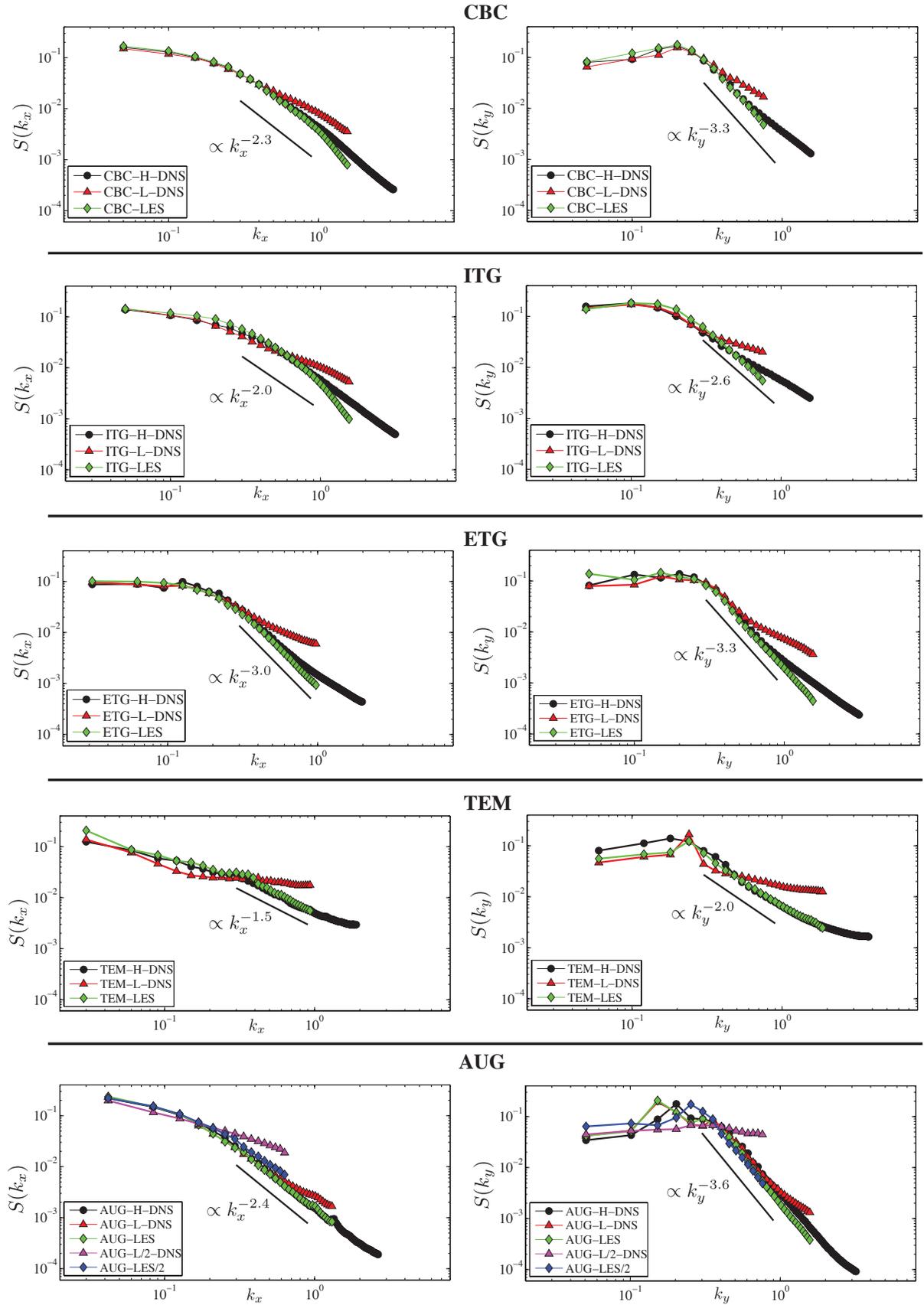


FIG. 1. (color online) Mean square density fluctuation spectra for the simulations described in Table I. The spectra are normalized by the wavenumber integrated value and the wavenumbers are in units of the dominant species gyro-radius (ρ_i for ITG and ρ_e for ETG) for single-species simulations, and in ρ_s units (ion gyroradius at electron temperature) in the case where two species are considered (TEM and AUG).

anticipate now (more details are given in the next section) that this is due to an accumulation of free energy. Indeed, since this case represents a stronger turbulent case compared to the CBC, the importance of numerically removing accurately the energy at smaller scales becomes more important. The ETG set of parameters is another example of the flattening of spectra even at the H-DNS resolution, observed in this case in both spectra. These simulations, dominated by streamers, can be considered as an equivalent of stronger turbulent simulations. For this case, the exponents are $\alpha_x = 3.0$ and $\alpha_y = 3.3$. The fourth set of simulations, given by TEM turbulence, power law exponents of $\alpha_x = 1.5$ and $\alpha_y = 2.0$ are found. Here, a good agreement between the H-DNS and LES simulations is observed. In contrast, the L-DNS presents now practically flat spectra. Therefore, it seems evident that for this case the use of LES methods for the low resolution simulations is needed.

The previous cases show how the LES procedure can be successfully applied to different types of microturbulence. However, these are simple setups, and the resulting exponents cannot be compared directly with experimental measurements. For this reason, we finally also consider a realistic example of ITG turbulence. Here, the power law exponents are $\alpha_x = 2.4$ and $\alpha_y = 3.6$. Interestingly, there is a good agreement between AUG-H-DNS, AUG-LES, and AUG-L-DNS, although the latter displays a flattening of the spectra at the highest wavenumbers. Moreover, it is possible to further decrease the resolution without changing the values of the heat and particle fluxes. For this reason, two additional simulations are included, AUG-L/2-DNS (in purple) and AUG-LES/2 (in blue), see Fig 1. Now the differences are more evident: while AUG-LES/2 overlaps perfectly with the LES and H-DNS simulations, L/2-DNS exhibits flat spectra. This shows that for some cases with very limited resolution, LES methods can succeed in recovering the correct power law exponents for experimentally relevant cases.

At this point, it is worth to mention the anisotropy observed in the simulations for all the cases, see Table II for a summary of the results. In general, the α_y exponents are higher than the α_x . Such deviations from isotropy should be taken into account when comparing numerical with experimental results. In particular, because in the experimental measurements often consider $k_x = 0$ contributions and the measurements are done in the outboard mid-plane ($z = 0$ plane in GENE). Therefore, for the AUG dataset the $S(k_y, k_x = 0) = \langle |\tilde{n}_e(k_x, k_y, z, t)|^2 \rangle_{k_x=0, z=0, t}$ spectrum is shown in Fig. 2. In this case, the calculated exponent is higher, rising to a value of $\alpha_y = 5.2$. Moreover, the recovery of the same $\alpha_y = 5.2$ value by the two LES runs possessing different resolutions, shows the tendency of LES methods to converge on the correct dynamical results. This behavior is not found by the DNS runs (L and L/2 runs differ drastically from each other).

Finally, in addition to the shape of the spectra, it is also important to calculate the wavenumber integrated value $\langle \tilde{n}^2(k_x, k_y, z) \rangle_{k_x, k_y, z}$. However, since small scales are truncated in the LES and L-DNS runs, it is not possible to integrate up the same scale as in the H-DNS simulation. Therefore, an estimate of the contribution from the truncated scales is certainly desirable if a comparison has to be made with experi-

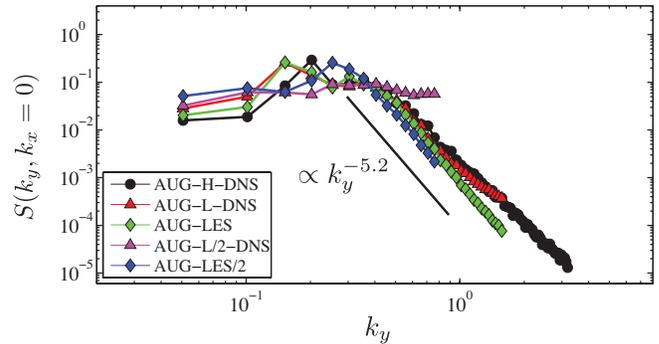


FIG. 2. (color online). Mean square density fluctuation spectra $S(k_y, k_x = 0)$ in the outboard mid-plane for the AUG data set. The spectra are normalized by the wavenumber integrated value, and the wavenumbers are in ρ_s units.

mental results. For this reason, an estimate for the truncated scale contribution is proposed by fitting a power-law to the spectrum and extrapolating to unresolved scales when integrating to the total fluctuation level. (For specific details see Ref. 15.) The results are summarized in Table II. While the differences regarding the wavenumber integrated electron density for LES simulations can exceed 45% for the lowest resolution AUG case, simulations without a LES model are even much more inaccurate, exhibiting relative errors up to about 200%.

To summarize, we have shown that LES methods provide a better accuracy in the calculation of power law exponents for different scenarios and type of instabilities. Since the use of LES does not increase the cost of the simulations in comparison with normal (DNS) simulations with the same resolution, it should be considered whenever possible. In particular, LES behaves better than simulations with two times more resolution in each of the perpendicular coordinates, at fraction of the cost (at least 4 times cheaper than the H-DNS simulations).

| Name | CBC | ITG | ETG | TEM | AUG |
|---|------|------|------|------|----------|
| α_x | 2.3 | 2.0 | 3.0 | 1.5 | 2.4 |
| α_y | 3.0 | 2.2 | 3.6 | 2.0 | 3.2(5.2) |
| $\langle \tilde{n}^2 \rangle^{\text{LES}} / \langle \tilde{n}^2 \rangle^{\text{DNS}}$ | 0.87 | 0.98 | 1.26 | 1.41 | 0.71 |
| $\langle \tilde{n}^2 \rangle^{\text{L-DNS}} / \langle \tilde{n}^2 \rangle^{\text{DNS}}$ | 1.02 | 1.79 | 0.95 | 2.11 | 0.63 |
| $\langle \tilde{n}^2 \rangle^{\text{LES/2}} / \langle \tilde{n}^2 \rangle^{\text{DNS}}$ | — | — | — | — | 0.52 |
| $\langle \tilde{n}^2 \rangle^{\text{L/2-DNS}} / \langle \tilde{n}^2 \rangle^{\text{DNS}}$ | — | — | — | — | 1.3 |

TABLE II. Fitted power law exponents for the density fluctuation spectra, together with the wavenumber integrated value of the electron density for the LES and L-DNS simulations normalized to the total value of the H-DNS simulation. For the AUG case, the value in brackets indicates the power law exponent for the $S(k_y, k_x = 0)$ spectrum.

C. Free energy studies

The previous analysis looked at the density fluctuation spectra. However, although not measurable experimentally, it is the free energy (see Ref. 24) which determines the resulting power laws observed in other quantities (such as density/temperature fluctuations). The study of the free energy is also important to understand the dynamics of the system and the range of validity of LES methods. The free energy ($\mathcal{E} = \mathcal{E}^f + \mathcal{E}^\phi + \mathcal{E}^A$), consisting in the mixing of entropy (\mathcal{E}^f), electric (\mathcal{E}^ϕ) and (\mathcal{E}^A) magnetic energies, is the quantity that is injected into the system by the gradients and dissipated by collisions. Moreover, free energy is redistributed between different scales by the action of the nonlinear term, without global gains or losses. The global free energy is also known as a nonlinear invariant quantity and has been proved to have many similarities with the kinetic energy in fluid turbulence¹⁹. For these reasons, in the following we will introduce and analyze in detail different free energy diagnostics.

1. Free energy fluctuation spectra

Formally, the free energy spectral density is defined as

$$\mathcal{E}_k = \left\langle g_k \left[\frac{n_0 T_0}{2 F_0} h_k \right] \right\rangle_{z, v_{\parallel}, \mu, j}, \quad (16)$$

where $\langle \dots \rangle$ represents an integration over the listed index. The background density and temperature level is given by n_0 and T_0 , respectively. F_0 represents the Maxwellian contribution to the total distribution function.

The free energy fluctuation spectra are plotted in Fig. 3 with regard to k_x and k_y . All spectra (\mathcal{E}_y and \mathcal{E}_x) are normalized by their respective wavenumber integrated value ($\mathcal{E} = \langle \mathcal{E} \rangle_{k_x, k_y}$). As before, the free energy spectrum in the binormal direction \mathcal{E}_y peaks at $k_y \propto 0.1 - 0.2$ and a power law $\mathcal{E}_y \propto k_y^{\beta_y}$ is present. The radial wavenumber spectrum \mathcal{E}_x peaks at $k_x = 0$ and has also a power law $\mathcal{E}_x \propto k_x^{\beta_x}$ for higher wavenumbers. Table III shows a summary with the power law exponents calculated for the different data sets. For all cases, the anisotropy in the spectra is also found. Note that although we are computing the same quantity, i.e. the free energy, we obtain different power law exponents for different instabilities. This could seem as a contradiction if one would compare with classical fluid turbulence, where the $-5/3$ Kolgomorov exponent is expected independently of the type of mechanism which drives the system. However, for gradient-driven GK turbulence, this is not the case, and these results seems to indicate a non-universality of the power law exponents. This is an area of current research and the specific details of the different mechanisms giving rise to the different power laws observed are out of the scope of this work. Here, we give the numerical values as a reference, since they could help to validate future analytical theories and are useful for comparisons with other gyrokinetic codes. In addition, the wavenumber integrated value of the free energy is also shown in Table III.

Comparing to the H-DNS value, the total free energy can exceed 250% for L-DNS simulations, while for the LES simulations differences only up to 40% are found.

Analyzing in detail the different cases, similar conclusions as for the density fluctuation spectra can be drawn for all cases, although now the differences between H-DNS, L-DNS and LES simulations are more evident: LES simulations present always a power law, while both H-DNS and L-DNS presents a more clear flattening of the spectra. For instance, looking at the ITG data set, and in particular at the H-DNS simulation, we observe that it has a flat spectrum. This is also the case for the L-DNS simulation. However, the LES still presents a power law. The reason for this behavior is the free energy accumulation of the DNS runs, which again shows that DNS runs are in fact, to different degrees, unresolved simulations. For a proper DNS run, the tail of the spectrum is expected to decrease in value at a faster rate than in the cascade range and not to posses a shallower slope.

Thus, the free energy is a good indicator to check if a simulation is well resolved. Looking at the spectra, and in particular the small scales behavior, one can distinguish if a simulation requires a larger resolution or not. An accumulation of energy at high wavenumbers will quickly amount to a change in the nonlinear dynamics and is undesirable. As the LES models are derived from the nonlinear transfers, the energy can be seen as being transferred to the unresolved range of scales rather than being arbitrarily removed. These effects, although being more evident for the free energy, as discussed in the previous section, are also present in other relevant quantities, such as potential, density or temperature fluctuations. Finally, considering the spectral slope extension into the unresolved range of wavenumbers, it can be seen than a LES run can provide better results than a high resolution DNS at a fraction of the cost.

| Name | CBC | ITG | ETG | TEM | AUG |
|--|------|------|------|------|------|
| β_x | 1.3 | 1.6 | 1.8 | 1.2 | 2.0 |
| β_y | 1.6 | 1.6 | 1.9 | 2.0 | 3.0 |
| $\mathcal{E}^{\text{LES}} / \mathcal{E}^{\text{DNS}}$ | 0.84 | 0.75 | 1.05 | 1.39 | 0.85 |
| $\mathcal{E}^{\text{L-DNS}} / \mathcal{E}^{\text{DNS}}$ | 1.71 | 2.76 | 2.29 | 2.12 | 0.82 |
| $\mathcal{E}^{\text{LES}/2} / \mathcal{E}^{\text{DNS}}$ | — | — | — | — | 0.75 |
| $\mathcal{E}^{\text{L}/2-\text{DNS}} / \mathcal{E}^{\text{DNS}}$ | — | — | — | — | 1.65 |

TABLE III. Fitted power law exponents for the free energy fluctuation spectra, together with the wavenumber integrated value of the free energy for the LES and L-DNS simulations normalized to the total value of the H-DNS simulation.

2. Nonlinear transfer spectra

Until now, we have discussed the free energy spectra. In order to understand how these spectra are formed, we need to study the nonlinear cross-scale transfer of free energy. The

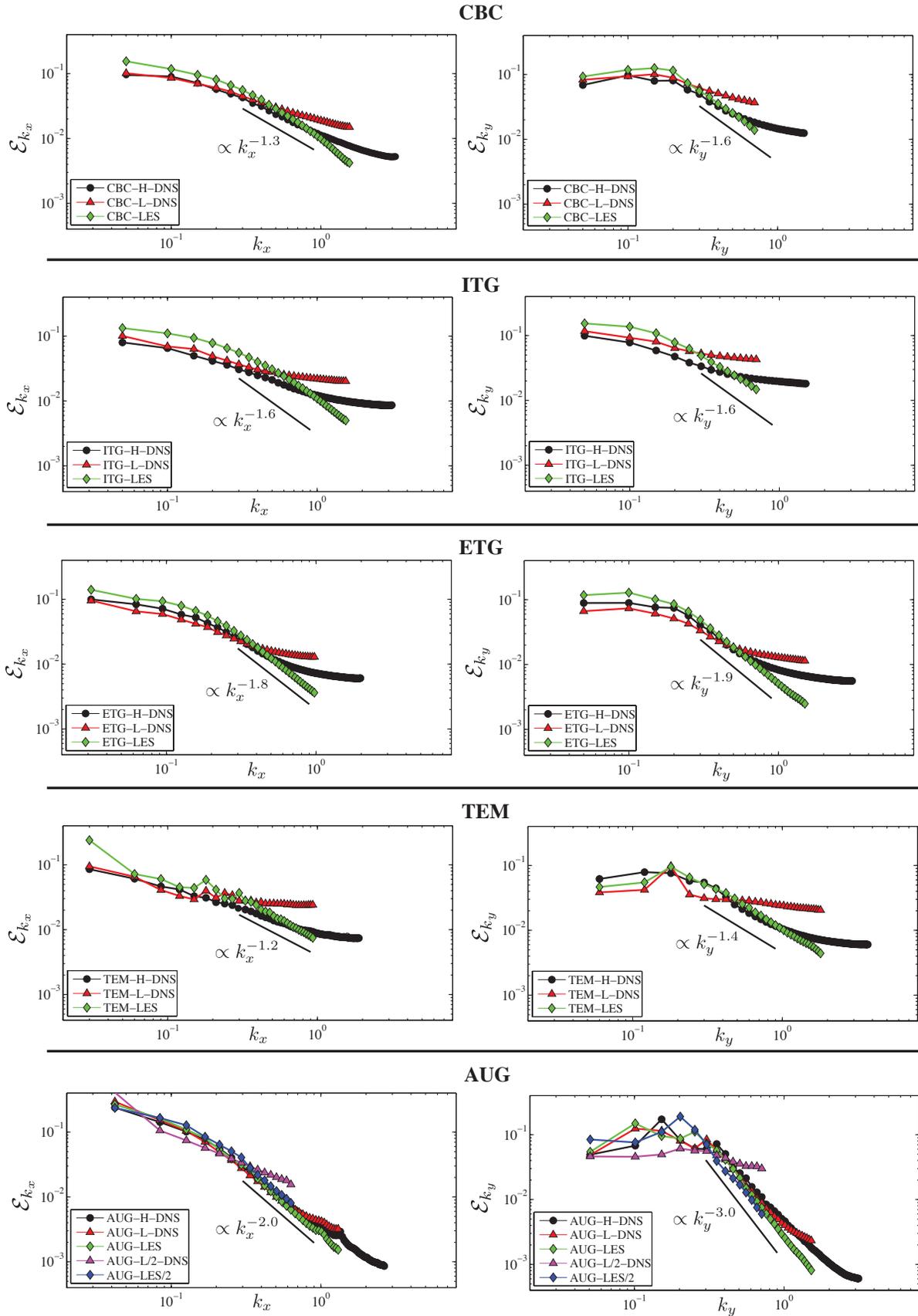


FIG. 3. (color online) Free energy spectra for all the simulations described in Table I. The spectra are normalized by the wavenumber integrated value and the wavenumbers are in units of the dominant species gyro-radius (ρ_i for ITG and ρ_e for ETG) for single-species simulations and in ρ_s units (ion gyroradius at electron temperature) in the case where two species are considered (TEM and AUG).

corresponding spectral balance equation has the form

$$\frac{\partial \mathcal{E}_k}{\partial t} = \mathcal{L}_k + \mathcal{D}_k + \mathcal{T}_k. \quad (17)$$

Here, \mathcal{L}_k represents the linear contributions composed by the free energy injected into the system at scale k (by the temperature/density gradients) as well as the contributions for the parallel and curvature terms. The term \mathcal{D}_k is the local dissipation, and \mathcal{T}_k is the nonlinear free energy transfer term. The latter represents the redistribution of free energy between all modes \mathbf{k} that contribute to a scale k , due to the interaction with modes \mathbf{p} and $\mathbf{q} = -\mathbf{k} - \mathbf{p}$, i.e. all triad interactions that have the k scale as one of the legs:

$$\mathcal{T}_k = \int \int dp dq \mathcal{T}(k|p, q), \quad (18)$$

$\mathcal{T}(k|p, q)$ being the interaction between three scales defined formally as,

$$\mathcal{T}(k|p, q) = \int_{|\mathbf{k}|=k} d\mathbf{k} \int_{|\mathbf{p}|=p} d\mathbf{p} \int_{|\mathbf{q}|=q} d\mathbf{q} \mathcal{T}(\mathbf{k}|\mathbf{p}, \mathbf{q}) \delta(\mathbf{k}+\mathbf{p}+\mathbf{q}), \quad (19)$$

where the fundamental triad transfer has the form

$$\mathcal{T}(\mathbf{k}|\mathbf{p}, \mathbf{q}) = \left\langle \frac{n_0 T_0}{2F_0} [q_x p_y - q_y p_x] [\chi_{\mathbf{q}} h_{\mathbf{p}} - \chi_{\mathbf{p}} h_{\mathbf{q}}] h_{\mathbf{k}} \right\rangle_{z, v_{\parallel}, \mu, j} \quad (20)$$

For the GyroLES approach, it is also possible to write the spectral free energy balance equation for resolved scales,

$$\frac{\partial}{\partial t} \mathcal{E}_{k|k_c}^< = \mathcal{L}_{k|k_c}^< + \mathcal{D}_{k|k_c}^< + \mathcal{T}_{k|k_c}^< + \mathcal{T}_{k|k_c}^{SGS}. \quad (21)$$

The sub-grid transfer $\mathcal{T}_{k|k_c}^{SGS}$ represents the transfer of energy between resolved scales $k < k_c$ and sub-grid scales $k > k_c$. It is related to the free energy transfer by

$$\mathcal{T}_{k|k_c}^{SGS} = \mathcal{T}_k - \mathcal{T}_{k|k_c}^<. \quad (22)$$

This equation provides a simple method to compute $\mathcal{T}_{k|k_c}^{SGS}$ through two calculations of the transfer terms. It consists of taking a Direct Numerical Simulation (DNS) and a test-filter DNS simulation at the characteristic scale k_c . Since all the information of free energy transfer \mathcal{T}_k is available in addition to the largest scale one, we can also calculate $\mathcal{T}_{k|k_c}^<$ as the difference of the two. This method was used in previous works^{15,16} to study the properties of the sub-grid transfer. It was found out that its effect is to systematically dissipate free energy from the system. This is the main reason behind choosing a hyper-diffusion LES model, as it can be proved analytically that for positive free parameters this term dissipates free energy at all times. However, in the dynamic procedure introduced in the previous section, there is not a constraint regarding the sign of the free parameter, and in fact, sometimes it can be negative. For this reason, the free energy dissipative effect of the model is guaranteed by setting to zero any negative coefficient values in Eq. (12).

In the following, we will study the free energy transfers defined in terms of the perpendicular wavenumber $k = [g^{xx} k_x^2 + 2g^{xy} k_x k_y + g^{yy} k_y^2]^{1/2}$ which is directly related to physical scales (in contrast to k_x and k_y). Here, g^{xx} , g^{xy} and g^{yy} are the geometric coefficients associated with the field-aligned coordinate system²⁵. In the free energy balance equation, Eq. 17, the nonlinear free energy transfer (\mathcal{T}_k) represents the energy received by a scale (k) from the interaction with all other scales in the system. A positive value indicates that energy is received, while a negative one shows that energy is in fact removed from that scale. Unlike linear quantities, reducing the resolution available to the system limits the interactions between scales and changes the \mathcal{T}_k spectra. To see this effect and the implication on LES methods, we concentrate on the ETG data set, although similar conclusions can be obtained for the other cases. In Fig.4 we plot the spectral decomposition of the transfer \mathcal{T}_k into the transfer $\mathcal{T}_{k|k_c}^<$ (dotted-black line) arising from the interaction of solely large scales ($k < k_c$) and the transfer spectra $\mathcal{T}_{k|k_c}^{SGS}$ (dashed-blue line) involving all other interactions. Since k_c is the maximal scale obtained by halving the ETG-H-DNS resolution, it is clear that a large portion of computation costs is dedicated to a small dynamical range. However, this small range cannot be simply removed, as its effect on \mathcal{T}_k is evident, i.e., $\mathcal{T}_{k|k_c}^<$ and $\mathcal{T}_{k|k_c}^{SGS}$ are comparable in amplitude.

For a LES run, the $\mathcal{T}_{k|k_c}^<$ signal is computed directly ($\mathcal{T}_{k|k_c}^< = \mathcal{T}_k$) while the $\mathcal{T}_{k|k_c}^{SGS}$ is accounted by the model. The model contribution (dashed-green line) and the actual $\mathcal{T}_{k|k_c}^{SGS}$ signal (dashed-blue line) are in the same order of magnitude for low k , but start to deviate when $\mathcal{T}_{k|k_c}^{SGS}$ changes its character from a sink to a source. This is to be expected, as the model amplitude obtained from the dynamical procedure is always taken to be positive for a hyper-diffusivity LES model. Looking at the resolved transfer spectra ($\mathcal{T}_{k|k_c}^<$, dotted-black line) we see a good agreement with the LES transfer spectra (\mathcal{T}_k , dotted-green line). Moreover, considering the ETG-L-DNS run, which has the same resolution as ETG-LES and differs from the ETG-H-DNS runs by the $\mathcal{T}_{k|k_c}^{SGS}$ term, we see that the low resolution DNS transfer spectra (\mathcal{T}_k , dotted-red line) deviates more from the resolved spectra than the LES run.

To account for the large resolution DNS (ETG-C-DNS) free energy transfer (\mathcal{T}_k), both the LES resolved and the model contributions need to be considered. In Fig. 5 we plot the sum of these contributions to a LES run. We can see that smaller DNS runs (obtained in the absence of a model) generate a transfer spectra that deviate more and more compared to the largest DNS one at low k . In comparison, the LES transfer spectra plus the model contribution try to match the DNS transfer curve, partially successful at lower k , regardless of the cutoff.

3. Shell-to-shell transfer

The shell-to-shell transfer represents an additional diagnostic that can show the advantage of the LES method. The diagnostic consists in filtering the the distribution function and

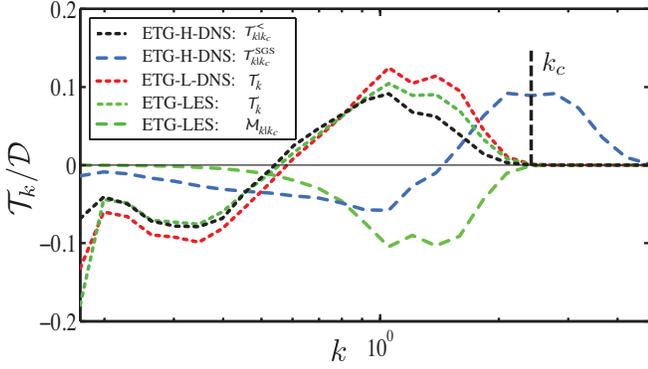


FIG. 4. Nonlinear free energy transfer spectra for the ETG set of data. The vertical dotted lines denote maximal scales available for the smaller resolutions.

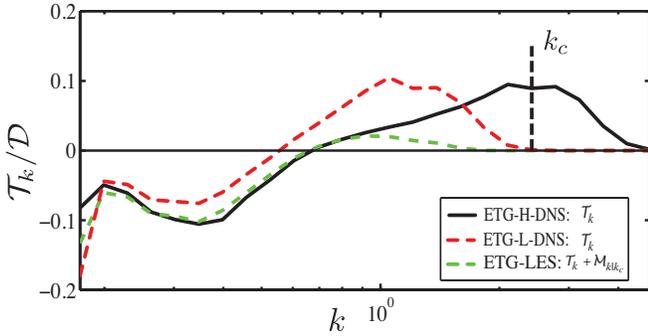


FIG. 5. Nonlinear free energy transfer spectra for the ETG set of data. The vertical dotted lines denote maximal scales available for the smaller resolutions.

considering only the modes contained in shell like structures $s_K = [k_{K-1}, k_K]$, before building the free energy transfer functions. The boundary wavenumbers (k_K) are given as a geometric progression, here $k_K = k_0 \times 2^{(K-1)/5}$, and the shell-filtered distribution functions $g_{\mathbf{k}}^K$ are given by

$$g_{\mathbf{k}}^K = \begin{cases} g_{\mathbf{k}}, & |\mathbf{k}| \in s_K \\ 0, & |\mathbf{k}| \notin s_K \end{cases}. \quad (23)$$

It is important to realize that the shell-filtered distribution functions are well defined in real space, the total signal being recovered as the superposition of all scale filtered contributions, $g = \sum_K g^K$. As the time evolution of the distribution function, due solely to the nonlinear term, can be expressed as the sum of shell-filtered contributions,

$$\frac{\partial g}{\partial t} \Big|_N = \sum_P \left[\frac{\partial \chi}{\partial y} \frac{\partial h^P}{\partial x} - \frac{\partial \chi}{\partial x} \frac{\partial h^P}{\partial y} \right], \quad (24)$$

the resulting nonlinear evolution of the free energy contained

in a shell ($\mathcal{E}^K = \left\langle \frac{n_0 T_0}{2F_0} g h^K \right\rangle_{x,y,z,v_{\parallel},\mu,j}$) has the form,

$$\begin{aligned} \frac{\partial \mathcal{E}^K}{\partial t} \Big|_N &= \sum_P \left\langle \frac{n_0 T_0}{2F_0} \left[\frac{\partial \chi}{\partial y} \frac{\partial h^P}{\partial x} - \frac{\partial \chi}{\partial x} \frac{\partial h^P}{\partial y} \right] h^K \right\rangle_{x,y,z,v_{\parallel},\mu,j} \\ &= \sum_P \mathcal{P}^{K,P}, \end{aligned} \quad (25)$$

where $\mathcal{P}^{K,P}$ represents the free energy received by shell K from shell P .

The same quantity can also be obtained directly from the modes. Starting from the triad transfer definition (Eq. 20), we shell-filter the field before computing the transfer,

$$\bar{\mathcal{T}}(\mathbf{k}|\mathbf{p}, \mathbf{q}) = \left\langle \frac{n_0 T_0}{2F_0} [q_x p_y - q_y p_x] [\chi_{\mathbf{q}} h_{\mathbf{p}}^P - \chi_{\mathbf{p}} h_{\mathbf{q}}^P] h_{\mathbf{k}}^K \right\rangle_{z,v_{\parallel},\mu,j}. \quad (26)$$

For $\bar{\mathcal{T}}(\mathbf{k}|\mathbf{p}, \mathbf{q})$, the manifest symmetry in \mathbf{q} and \mathbf{p} of the triad transfers is broken effectively by the shell-filtering procedure, as $h_{\mathbf{q}}^P = 0$ for $q \notin s_P$. The shell-to-shell transfer is then defined simply as

$$\mathcal{P}^{K,P} = \int_{|\mathbf{k}| \in s_K} d\mathbf{k} \int_{|\mathbf{p}| \in s_P} d\mathbf{p} \int_{-\infty}^{\infty} d\mathbf{q} \bar{\mathcal{T}}(\mathbf{k}|\mathbf{p}, \mathbf{q}) \delta(\mathbf{k} + \mathbf{p} + \mathbf{q}). \quad (27)$$

It has the interpretation of the energy received by modes located in a shell K from modes located in a shell P by the interaction with all other possible modes. Due to the conservation of interactions, $\mathcal{P}^{K,P} = -\mathcal{P}^{P,K}$ and $\mathcal{P}^{K,K} = 0$. Since the shell boundaries are taken as a power law, the normalized results to the maximal shell transfer, provides us with information regarding the direction and locality of the energy cascade. We designate a transfer to be direct if it is positive for $K > P$ and we call it to be local if $|K - P| \sim 5$.

In Fig. 6 we look at the shell-to-shell transfer for the ETG case. The dotted line plotted for the ETG-H-DNS run represents the k boundary induced by the LES wavenumber filter. It is interesting to note that while the resolved scales shell transfers (obtained implicitly from Eq. (26) by applying the LES filter before the shell filters) are clearly bounded by this limit, the SGS shell-to-shell transfers penetrate strongly below it, indicating that wavenumbers larger than the LES cut-off contribute to scales smaller than k_c . From this picture, the advantage of the LES method is obvious. The cascade recovered by the LES run behaves in a good part as the large filtered scales cascade for the larger DNS run. In comparison, the reduced DNS run (ETG-L-DNS) has stronger off-diagonal contributions and even exhibits a change in the direction of the cascade for the first few shells. This change in the direction of the cascade, for a limited resolution DNS, can also be seen in the case of TEM, see Fig. 7. However, while this is strong effect for TEM, almost no effect is observed for ITG driven simulations. For the CBC, ITG and AUG cases, the small resolution DNS runs have a very similar form compared to their respective large resolution counterparts.

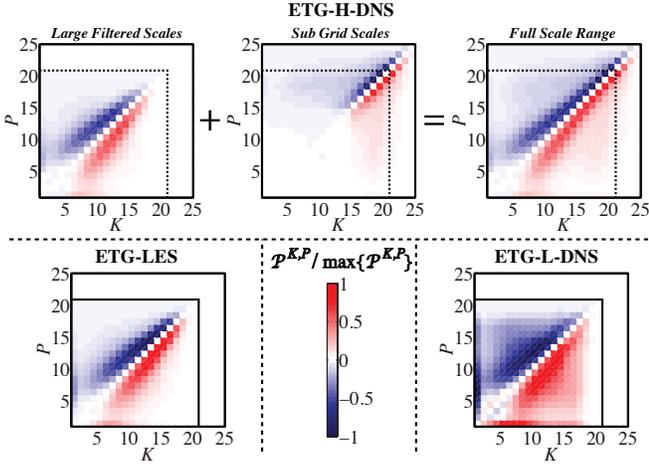


FIG. 6. Shell-to-shell transfer for the ETG case. The dotted line plotted for the H-DNS run corresponds to the LES wavenumber filter boundary. All transfers for a run are normalized to the respective run maximal value and $k_0 = 0.173$ in the shell boundary power law.

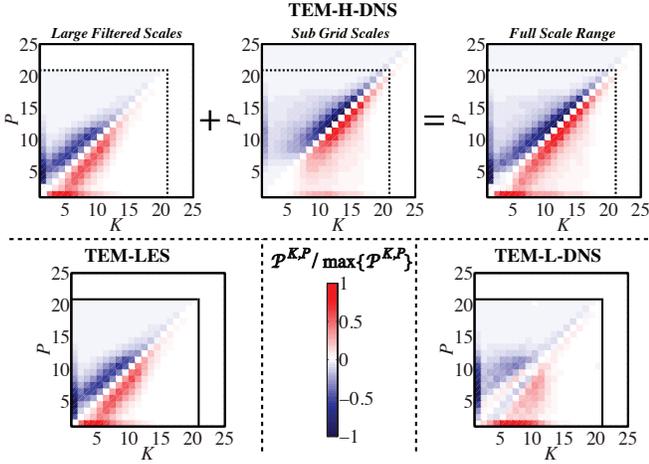


FIG. 7. Shell-to-shell transfer for the TEM case, summed over all species. The dotted line plotted for the H-DNS run corresponds to the LES wavenumber filter boundary. All transfers for a run are normalized to the respective run maximal value and $k_0 = 0.439$ in the shell boundary power law.

4. Free energy fluxes

In addition to the spectral free energy balance equation for a scale k , it is also worth to look at the free energy contained by all the scales larger than k . Integrating the resolved scales free energy balance equation (21), we find,

$$\frac{\partial}{\partial t} \int_0^k \mathcal{E}_{k'|k_c}^< dk' = \int_0^k \left[\mathcal{L}_{k'|k_c}^< + \mathcal{D}_{k'|k_c}^< \right] dk' + \Pi_{k|k_c}^< + \Pi_{k|k_c}^{SGS}, \quad (28)$$

where the resolved-scales-only flux and the sub-grid scale flux, respectively, are defined as,

$$\Pi_{k|k_c}^< = \int_0^k \mathcal{T}_{k'|k_c}^< dk', \quad (29)$$

$$\Pi_{k|k_c}^{SGS} = \int_0^k \mathcal{T}_{k'|k_c}^{SGS} dk', \quad (30)$$

and provide the free energy transfer rate from all scales larger than k to all scales smaller than k . At the LES cutoff k_c , due to the conservation of nonlinear interactions ($\mathcal{T}_{k|p,q} + \mathcal{T}_{p|q,k} + \mathcal{T}_{q|k,p} = 0$), the large scales flux goes to zero ($\Pi_{k|k_c}^< = 0$), as it involves all possible interactions between resolved-scales-only modes. As the total free energy flux consists in the sum of the two fluxes ($\Pi_k = \Pi_{k|k_c}^< + \Pi_{k|k_c}^{SGS}$), for $k \geq k_c$, it reduces to the SGS contribution. Since the SGS flux at the scale k_c represents the energy that needs to be removed globally by the LES model, it is also known as the total sub-grid dissipation.

For GyroLES to work, the correct amount of free energy has to be dissipated. This property can be checked by matching the sub-grid flux to the scale integrated dissipation of the model,

$$\Pi_{k|k_c}^{SGS} \approx \int_0^k \mathcal{M}_{k'|k_c}[a] dk', \quad (31)$$

where $\mathcal{M}_{k|k_c}[a]$ represents the free energy contribution of the model $\mathcal{M}_{k|k_c}[a]$. This can be satisfied through the free parameters of the model, i.e., finding the right parameter values that satisfy the previous relation. This is indeed a tendency that is recovered implicitly through the dynamic procedure in Eq. (12).

Looking at the ETG dataset from the perspective of the non-linear fluxes in Fig. 8, we observe that the ETG-LES flux (Π_k , dashed-green line) seems to match well the largest scale k_c filtered DNS flux ($\Pi_{k|k_c}^<$, dashed-red line). Since both the filter DNS and the LES runs do not have any information above k_c , the flux goes to zero on this surface. This is also the point where the DNS flux (Π_k , solid-black line) and the SGS flux ($\Pi_{k|k_c}^{SGS}$, dotted-blue line) have the same value, although, the SGS flux tends to make the dominant contributions long before that point. It is also worth mentioning that the DNS flux does not saturate at the value of the total free energy injected in the system. As the dissipation can act in all perpendicular scales, only a ratio of free energy injected gets transferred to the smallest scales. This value is designated by $\mathcal{L}^+/\mathcal{D}$, where \mathcal{L}^+ represents the total source of all linear terms (including linear dissipations). A larger $\mathcal{L}^+/\mathcal{D}$, tending to one, denotes that a larger amount of free energy injected into the system is passed down to smaller scales. In our case, $\mathcal{L}^+/\mathcal{D} = 0.7$, meaning that the 70% of the free energy injected into the system is transferred to smaller scales.

It is interesting to consider the scale integrated contribution of the LES model (dotted-green line). Slowly increasing in amplitude from the large scales, it saturates at the level of the maximal value of the DNS flux, without decreasing in value. This is due to the fact that the model amplitude is always

positive. Looking together at the LES flux and model contributions we obtain an effective flux (solid-green line) quickly reaches and remains at the DNS saturation value. This is not that surprising as the implicitly assumption of an infinite inertial range is incorporated into the model. This assumption is the reason behind the spectral slope quality of the LES runs compared to the DNS ones.

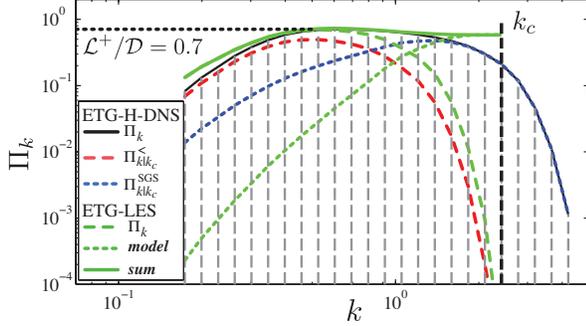


FIG. 8. Free energy flux and components for selected ETG runs. The saturation value for the flux is given as $\mathcal{L}^+/\mathcal{D}$, were \mathcal{L}^+ represents the total source of all linear terms, and k_c is the LES cutoff.

5. Sub-grid scale locality

It is important to remark that in the definition of the sub-grid flux, the transfer of energy from scales below k_c to scales above k_c does not tell us if the contribution to the flux arises primarily from scales close in value to k_c or from scales with much smaller wavenumber. It also does not tell us, independently from where the energy comes from, towards which scales is the energy primarily distributed. This is very important for an application of GyroLES models. Indeed, GyroLES models rely on the locality of interactions assumption between resolved and sub-grid scales. In order to further investigate that assumptions, we will consider the classical locality ultraviolet (UV) and infrared (IR) functions, introduced by Kraichnan²⁶ and recently applied to gyrokinetics²⁷, for the SGS flux,

$$\begin{aligned} \Pi_{UV}^{SGS}(k_p|k_c) = & \int_0^{k_c} dk \left[\iint_{k_p}^{\infty} \mathcal{T}(k|p, q) dp dq + \right. \\ & \left. 2 \int_0^{k_p} \int_{k_p}^{\infty} \mathcal{T}(k|p, q) dp dq \right] \quad \text{with } k_p \geq k_c, \end{aligned} \quad (32)$$

$$\begin{aligned} \Pi_{IR}^{SGS}(k_p|k_c) = & \int_{k_c}^{\infty} dk \left[\iint_0^{k_p} \mathcal{T}(k|p, q) dp dq + \right. \\ & \left. 2 \int_0^{k_p} \int_{k_p}^{\infty} \mathcal{T}(k|p, q) dp dq \right] \quad \text{with } k_p \leq k_c. \end{aligned} \quad (33)$$

It is important to differentiate between the locality of the energy cascade, one structure giving energy to a similar size structure (as discussed in the shell-to-shell transfer section), from the locality of interactions captured by the locality functions, where the mediator of the energetic interaction is also considered.

The meaning of the locality functions is the following. The UV locality function represents the energy flux across k_c caused by nonlinear interactions that involve at least one scale above k_p (with $k_c \leq k_p$). In this case, a significant contribution would mean that the energy flux depends on the smallest scales and therefore on the type of small-scale dissipation. However, due to the resolutions employed and the LES cutoffs considered here, the UV locality information for the SGS flux is hard to determined numerically. By definition, we are interested in seeing where the energy is being transferred across k_c , requiring the contributions to decrease fast as to ensure a high level of separation between the resolved and unresolved scales. As the range of scales past k_c is limited and the amplitude of fluctuations are strongly damped, the UV locality information tends to be highly local. On the other hand, the IR locality information of the SGS flux is much more interesting to us, as it indicates the dependance of the unresolved scales to the information contained in the larger, resolved scales. It represents the energy flux across k_c due to nonlinear interaction that involve at least one scale below k_p (with $k_p \leq k_c$). Therefore, if there is a significant contribution, it implies that there is strong interaction with the largest scales and thus, a dependence of the type of instability that drives the system. This would imply that good GyroLES models should depend on the type of instability, and therefore, their universality could be questioned.

In Fig. 9, we plot the SGS IR locality functions normalized to the value of the flux through k_c . For $k_p = k_c$, as the locality functions recover the value of the flux, we obtain a unity value for this ratio. Increasing the separation between $k_p \leq k_c$ and k_c removes interactions from bringing contributions to the flux and as such, the ratio plotted decreases in value. The rate of this decrease gives us the assessment of the SGS flux locality. We also plot a series of slopes and their values. Except for the $(k_p/k_c)^{5/6}$ exponent value, which has a theoretical interpretation²⁷ and is considered here as a reference, all other slopes are based on numerical observations and are given simply as a way to help us understand the results. For all runs, the first two points smaller that $k_p/k_c = 1$ have a slope close to one, as the last few physical scales tend not to be fully represented. This is just a negligible artifact, arising from the small value ($2^{1/5}$) of the common ratio of the wavenumber geometric progression, coupled with the discretization of the wavenumber space. The $2^{1/5}$ selection is taken to emphasize any slopes that might arise for the locality functions.

Except for the ETG case, which seems to recover a 5/6 scaling³⁶, all other runs have a stronger nonlocal behavior, reaching a 1/2 slope. While this increased nonlocal tendency might be a factor to be considered for the LES modelling of the sub-grid terms (it can affect the ratio of the test filter wavenumber k_t compared to the cutoff k_c in the dynamical procedure), it is by no means something to worry about. In

fact, as the probe wavenumber k_p starts to enter the large scale range, the locality slopes accentuate drastically (the shallowest being ~ 2 , much more than the $5/6$ scaling³⁶). By the very nature of the driving instabilities, the interactions tend to become more local. This might be a result of entering the driving range, where the cascade itself tends to be weak, well below its free energy flux saturation value. Indeed, this change of locality exponent starts to appear at the maximum value of the free energy flux as shown in Fig. 8. Regardless of the cause, this accentuation of locality at low k helps mitigate any instability dependent physics and, even if this slope is expected to be instability dependent, the high values of the exponents ensures an effective universality of the SGS modelling and validates the GyroLES approach.

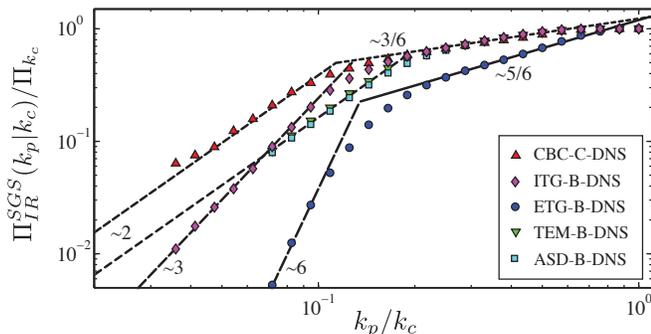


FIG. 9. IR locality functions for the SGS flux contribution. The value of k_c is taken to be half the largest k available for the largest DNS cases for each case. While k_p wavenumbers differ from case to case, they are taken as a geometric progression with a common ratio of $2^{1/5}$.

V. CONCLUSIONS

Via the application of the LES method to gyrokinetic turbulence driven by different kinds of microinstabilities (ITG, ETG, and TEM), two general improvements are obtained. First, the computational cost of the simulations can be considerably reduced, and second, the physical elimination of the free energy accumulation at small perpendicular scales helps to extract the correct power law exponents. These two effects are of help in pursuing direct comparisons between numerical simulations and experiments.

From the study of the free energy and density fluctuation spectra, it is found that the LES method provides systematically better indication of the existence of power laws than DNS simulations used. For some cases, in order to acquire a similar accuracy as for the LES runs, DNS simulations using at least double the resolution in each of the perpendicular directions have to be performed.

The reasons for the successful implementation of the sub-grid model in the gyrokinetic LES simulations can be briefly summarized as follows. The local character of the free energy transfer and interactions allows for the removal of small-scale interactions without affecting the overall behavior at large

scales. By modeling this effect correctly, as is done with the LES method in conjunction with the dynamic sub-grid procedure, one is able to have much better results than without it. This suggests that the LES method described in the present work is very helpful while computationally cheap, and should probably become standard for a wide range of applications.

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