

# A theory for the atmospheric energy spectrum: Depth-limited temperature anomalies at the tropopause

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**The horizontal spectra of atmospheric wind and temperature at the tropopause have a steep  $-3$  slope at synoptic scales, but transition to  $-5/3$  at wavelengths of the order of 500–1,000 km [Nastrom, G. D. & Gage, K. S. (1985) *J. Atmos. Sci.* 42, 950–960]. Here we demonstrate that a model that assumes zero potential vorticity and constant stratification  $N$  over a finite-depth  $H$  in the troposphere exhibits the same type of spectra. In this model, temperature perturbations generated at the planetary scale excite a direct cascade of energy with a slope of  $-3$  at large scales,  $-5/3$  at small scales, and a transition near horizontal wavenumber  $k_t = f/NH$ , where  $f$  is the Coriolis parameter. Ballpark atmospheric estimates for  $N$ ,  $f$ , and  $H$  give a transition wavenumber near that observed, and numerical simulations of the previously undescribed model verify the expected behavior. Despite its simplicity, the model is consistent with a number of perplexing features in the observations and demonstrates that a complete theory for mesoscale dynamics must take temperature advection at boundaries into account.**

geophysical turbulence | meteorology | atmospheric dynamics

In the 1970s, the National Aeronautics and Space Administration (NASA) instrumented commercial Boeing 747 airliners to collect atmospheric data during their regular flights (1) in an endeavor called the Global Atmospheric Sampling Program (GASP). The resulting data set consists of thousands of flight tracks, a few hundred of which are  $>10,000$  km long, collected over a 4-year period. Most flights occurred in the midlatitudes and tropics but span the full range of seasons. Because airliners travel at altitudes between 9 and 14 km, the data largely reflect the upper troposphere and lower stratosphere, near the tropopause. Atmospheric wavenumber spectra of horizontal wind and temperature computed from the GASP data set by Nastrom and Gage (ref. 1; hereafter NG85) show a distinct transition from a steep spectral slope of  $-3$  at synoptic scales ( $\approx 1,000$ – $3,000$  km) to a shallower slope of  $-5/3$  at mesoscales ( $\approx 10$ – $500$  km), with a fairly distinct transition centered at a horizontal wavelength of  $\approx 600$  km. Understanding the source and structure of this spectrum has posed a puzzle in atmospheric science for the past 20 years.

The spectrum is intriguing because it agrees so well at large scales with Charney's (3) theory of geostrophic turbulence but deviates from that prediction where it shallows. Moreover, the fact that the small-scale slope is  $-5/3$  invites multiple explanations, because that is the theoretical slope both for the forward cascade of energy in isotropic, three-dimensional (3D) turbulence, and for the inverse cascade of two-dimensional (2D) turbulence, as well as other systems. At the large scale, Charney argued (3), rotation and stratification conspire to make the atmosphere quasi-2D. Stirring by baroclinic instability (or any planetary mechanism) will induce a forward cascade of potential enstrophy, reflected in a  $-3$  kinetic energy spectrum below the stirring scale. Moreover, the theory predicts equipartition between kinetic and available potential turbulent energy, and so the temperature variance spectrum should have the same slope

as kinetic energy, just as observed. The forward enstrophy cascade in this theory should proceed down to scales at which rotation becomes less important, where unbalanced motions and instabilities might efficiently lead to dissipation. In the atmosphere, a reasonable estimate puts this scale an order of magnitude smaller than the observed transition scale.

## Previous Explanations

Explanations in the literature for the mesoscale spectrum fall into three general categories as follows: (i) an inverse cascade of small-scale energy, produced perhaps by convection (4–6); (ii) production of gravity waves by divergent flows (7–11); or (iii) a direct cascade of energy from the large scales (12–15). More recent observations and analysis present new facts that must be accommodated by theory. Regarding type (i) theories, Cho and Lindborg (16) analyzed horizontal velocity data from a series of thousands of flights in the late 1990s at altitudes between 9 and 12 km. From this analysis, they inferred a forward cascade of energy for scales of the order of 100 km and smaller. Regarding the hypotheses of type (ii), data collected on scales between 1 and 100 km over the Pacific Ocean (the Pacific Exploratory Mission; see ref. 17) indicate that mesoscale energy away from the equator is dominated by vortical modes rather than divergent ones (18). It is pointed out that observations over land may reveal more gravity wave energy at these scales than over the ocean, but even so, a complete theory cannot then rely solely on gravity waves to produce the mesoscale spectrum. In sum, the current state of observational evidence leaves only theories of type (iii) as plausible universal explanations of the NG85 data.

Tung and Orlando (ref. 12; hereafter TO03) propose a model that, at first glance, explains the observations. The basis of their argument is that the standard model of geostrophic turbulence proposed by Charney (3) is incomplete, because in any finite-width inertial range, there will always be some leakage of energy to small scales (19, 20). In their theory, the subdominant  $k^{-5/3}$  cascade reveals itself at the wavenumbers where the direct cascading energy spectra exceed that of the enstrophy cascade, namely for wavenumbers  $k > (\eta/\varepsilon)^{1/2}$ , where  $\varepsilon$  is the downscale energy flux and  $\eta$  is the enstrophy flux. TO03 support their theory with a small number of simulations using a standard numerical two-layer quasi-geostrophic forced by baroclinic instability. One of the present authors, however, noted that because the forward energy cascade rate  $\varepsilon$  depends on the dissipation scale, the transition scale of TO03 will always coincide with the effective Kolmogorov scale of the dissipation mechanism and so changes with

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Abbreviations: GASP, Global Atmospheric Sampling Program; SQG, surface quasigeostrophy; fSQG, finite-depth SQG; NG85, ref. 1 (Nastrom and Gage); TO03, ref. 12 (Tung and Orlando).

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filter strength and grid resolution (21). A similar spectrum to that found by TO03 can be obtained by underdissipating the forward enstrophy cascade, causing a buildup of enstrophy at the grid scale. For the theory of TO03 to be correct, then, the atmosphere must possess a mechanism that selectively dissipates the forward cascade at some fixed  $O(1 \text{ km})$  scale, independent of energy flux.

The compelling part of the TO03 argument is that the proposed mechanism relies on a forward cascade of vortical energy. An improved theory should also possess that characteristic. Lindborg (13, 14) demonstrated that a forward  $-5/3$  slope energy cascade can arise in highly stratified 3D turbulence when rotation is sufficiently weak, although no explicit connection to the synoptic scale is included in this theory. Kitamura and Matsuda (15) do find that such a mechanism seems to arise in a very high-resolution nonhydrostatic Boussinesq model and follows on the tails of a steep synoptic-scale spectrum. But in this case, much as seen by Koshyk, Hamilton, and coworkers (11, 22), the energy in the mesoscale spectrum is due to divergent motions. The latter fact is not consistent with the observations of Cho *et al.* (18).

### Idealized Tropopause Dynamics

The GASP observations were collected primarily near the tropopause, the boundary between the well mixed, low-potential vorticity troposphere and the more stratified, high-potential vorticity stratosphere (23, 24). Juckes (23) points out that when temperature anomalies of the tropopause and ground are in phase, the flow has a structure associated with barotropic flow, and also suggests that tropopause anomalies likely dominate tropospheric potential vorticity anomalies. [This viewpoint is closely related to the Eady model (25) of baroclinic instability, in which the tropopause interacts with a similar layer in the lower troposphere to produce baroclinic instability.] Juckes (23) estimates from observations that neglecting tropospheric potential vorticity anomalies will result in an error on the order of 20%. The model he proposes takes into account that the Ertel potential vorticity of the troposphere is nearly constant, and so the balanced dynamics arise primarily from the advection of tropopause temperature.

An idealization of this situation in which the depth of the interior fluid is assumed semiinfinite and the stratification assumed constant is termed “surface quasigeostrophy” (SQG). This model was first proposed by Blumen (ref. 26; but see also refs. 27–29) as a counterpoint to Charney’s theory, which explicitly assumes that boundary effects are negligible. By contrast, in SQG boundary advection determines the flow. The SQG equations are as follows:

$$\partial_t \theta + J(\psi, \theta) = 0, \quad z = 0, \quad [1a]$$

$$\theta = \partial_z \psi, \quad [1b]$$

$$q \equiv (\partial_{xx} + \partial_{yy} + \partial_z \sigma^{-2} \partial_z) \psi = 0, \quad z < 0, \quad [1c]$$

$$\psi \rightarrow 0 \text{ as } z \rightarrow -\infty, \quad [1d]$$

where  $\psi$  is the horizontal streamfunction,  $J(,)$  is the horizontal Jacobian, and  $\sigma = N/f$  is Prandtl’s ratio (in general  $N$  is a function of  $z$ , but here we will take it to be a constant). Fourier decomposition in the horizontal plane at  $z = 0$  leads to the separable solution

$$\hat{\psi}(\mathbf{k}, z) = (\sigma k)^{-1} e^{\sigma k z} \hat{\theta}(\mathbf{k}, 0), \quad [2]$$

where  $k = |\mathbf{k}|$  is the modulus of the horizontal wave-vector  $\mathbf{k}$ , and the hatted variables are spectral amplitudes. The flow is thus governed by the 2D dynamics at the boundary, where

$$\hat{\psi}(\mathbf{k}, 0) = (\sigma k)^{-1} \hat{\theta}(\mathbf{k}, 0),$$

yet the resulting flow is 3D.

The turbulent dynamics of SQG differ from those of quasigeostrophic turbulence because the conserved invariants of the system are distinct. In quasigeostrophic dynamics, the conserved invariants are the total energy  $E = -\langle \psi q / 2 \rangle$  and the potential enstrophy  $Z = \langle q^2 \rangle / 2$ , where  $\langle \rangle$  represents a volume average. In SQG the invariants are the temperature variance  $T = \overline{\theta^2} / 2$  and the total energy  $E_S = \overline{\psi \theta} / 2$ , where the overbar implies an area average at  $z = 0$ .<sup>†</sup>

Defining spectral densities such that  $E_S = \int \mathcal{E}_S(k) dk$  and  $T = \int \mathcal{T}(k) dk$ , the SQG invariants are related as  $\mathcal{T} = \sigma k \mathcal{E}_S$ . In the inverse cascade of total SQG energy, the densities have spectra  $\mathcal{E}_S \propto k^{-2}$  and  $\mathcal{T} \propto k^{-1}$ , whereas in the forward cascade of temperature variance one has  $\mathcal{E}_S \propto k^{-8/3}$  and  $\mathcal{T} \propto k^{-5/3}$  (26, 28).

### The Model

The fundamental model we propose here is a variant of SQG that highlights the transition between quasi-2D barotropic flow and baroclinic 3D flow. From the solution connecting  $\psi$  and  $\theta$  (Eq. 2), one sees that as the horizontal scale gets larger (or  $k$  gets smaller), the penetration depth of the temperature anomalies increases proportionally, with aspect ratio given by the Prandtl ratio,  $\sigma = N/f$ . At large enough scale, the penetration will reach deep into the troposphere and interact with the interior flow, if it ceases to be homogenized at some depth, or the lower boundary as an upper limit. The simplest possible extension of SQG that takes this effect into account is the restriction of the domain in Eq. 1 to a finite depth, specifically, replacing Eq. 1d with the condition  $\theta = 0$  at  $z = -H$ . In this case, the replacement of solution 2 is

$$\hat{\psi}(\mathbf{k}, z) = \left[ \frac{\cosh[\sigma(z+H)k]}{\sigma k \sinh(\sigma H k)} \right] \hat{\theta}(\mathbf{k}, 0), \quad [3]$$

which at the upper surface becomes

$$\hat{\psi}(\mathbf{k}, 0) = [\sigma k \tanh(\sigma H k)]^{-1} \hat{\theta}(\mathbf{k}, 0). \quad [4]$$

The remarkable property of this finite-depth SQG (fSQG) model results from the properties of the hyperbolic tangent in the inversion. At large scales, or  $k \ll (\sigma H)^{-1}$ , the temperature is related to the streamfunction like  $\hat{\theta}(\mathbf{k}, 0) \approx \sigma^2 H k^2 \hat{\psi}(\mathbf{k}, 0)$ , whereas at small scales, or  $k \gg (\sigma H)^{-1}$ , the inversion is approximately  $\hat{\theta}(\mathbf{k}, 0) \approx \sigma k \hat{\psi}(\mathbf{k}, 0)$ . Thus, the relation at the surface of streamfunction to advected quantity (temperature) transitions from a quasigeostrophy/2D-like inversion at large scales, to an SQG-like inversion at small scales, with the transition occurring at the wavenumber

$$k_t \equiv (\sigma H)^{-1} = \frac{f}{NH}. \quad [5]$$

Note that this predicted transition scale is only equal to the deformation scale when  $H$  is taken as the full depth of the troposphere, which we take as an upper bound. This topic will be considered further in *Discussion*.

<sup>†</sup>The invariant  $E_S$  is proportional to the total energy of the flow; multiplying the potential vorticity  $q$  by  $-\psi$  and integrating over volume, one has that

$$\langle |\nabla \psi|^2 + \sigma^{-2} \theta^2 \rangle = \sigma^{-2} H_a^{-1} \overline{\psi \theta}|_{z=0} - \langle \psi q \rangle,$$

which is just twice the total energy  $E$  (here  $H_a$  is some averaging depth). Thus, if  $q = 0$ , the total energy is  $E = (1/2) \sigma^{-2} H_a^{-1} \overline{\psi \theta} = \sigma^{-2} H_a^{-1} E_S$ .

The spectral slopes can be predicted as follows. Defining the spectral density of the streamfunction by the relation  $\psi^2/2 = \int \mathcal{P}(k) dk$ , the conserved invariants have the form

$$\mathcal{E}_s(k) = \sigma k \tanh(k/k_t) \mathcal{P}(k), \quad [6a]$$

$$\mathcal{T}(k) = [\sigma k \tanh(k/k_t)]^2 \mathcal{P}(k). \quad [6b]$$

In the present context, we are interested in the influence synoptic-scale stirring on the mesoscales, presumably due to baroclinic instability, and so we restrict our attention to the forward cascade regime, in which the conservation of temperature variance determines the spectrum by means of the standard phenomenology (30, 31). The temperature variance spectrum (Eq. 6b) has the same dimensions as kinetic energy, and so it is the flux of this boundary-flow energy that is constant in its inertial range

$$\varepsilon = k \mathcal{T}(k) \tau^{-1}(k) = \text{constant}, \quad [7]$$

where  $\tau(k)$  is the turbulent timescale at wavenumber  $k$ . Because the turbulent timescale is the advective timescale, we can express it in terms of the streamfunction spectrum,  $\tau(k) \approx [k^5 \mathcal{P}(k)]^{-1/2}$ . Using this expression in Eq. 7 and eliminating  $\mathcal{P}(k)$  with the help of Eq. 6b reveals that

$$\mathcal{T}(k) = C_T \varepsilon^{2/3} [\sigma \tanh(\sigma H k)]^{2/3} k^{-5/3}, \quad [8]$$

where  $C_T$  is the appropriate Kolmogorov constant.

It is the temperature variance spectrum that determines all other spectra in the direct cascade range, and so, for example, we can derive  $\mathcal{P}(k)$  through elimination of  $\mathcal{T}(k)$  between Eqs. 6b and 8, and similarly for  $\mathcal{D}_s(k)$ . More to the point, the kinetic energy spectrum is

$$k^2 \mathcal{P}(k) = [\sigma \tanh(\sigma H k)]^{-2} \mathcal{T}(k), \quad [9]$$

which thus takes on the small- and large-scale limits

$$k^2 \mathcal{P}(k) \approx \begin{cases} C_T \varepsilon^{2/3} (\sigma^2 H)^{-4/3} k^{-3}, & k \ll k_t \\ C_T \varepsilon^{2/3} \sigma^{-4/3} k^{-5/3}, & k \gg k_t \end{cases} \quad [10]$$

To summarize, the hypothesis is that synoptic-scale stirring produces a balanced, forward cascade of temperature variance at the tropopause (and perhaps at the ground as well). At large scales, the flow is quasi-barotropic because the penetration depth is large enough to interact with the interior flow (or the lower boundary as an upper limit), and here the cascade exhibits the same kinetic energy spectrum as in Charney's theory (3) of quasigeostrophic turbulence. As the cascade proceeds, the penetration depth of temperature anomalies decreases. When the vertical scale is small compared with the depth over which the tropospheric interior potential vorticity is homogenized, the cascade flattens to a  $-5/3$  slope, recovering its essential SQG-like nature. The accompanying temperature spectrum is considered in the discussion. The small-scale filter is adjusted for each simulation so that it acts only near the highest resolved wavenumber, as explained above. Each spectrum was calculated by averaging over time (for the portion of the simulation over which the flow was in steady state) and azimuthal angle in the horizontal plane.

### Numerical Tests of the Predicted Spectra

Here we present the results of a series of simulations of the fSQG model, forced by large-scale stirring and dissipated scale-selectively at both the domain and grid scales. The system modeled is just with added forcing and dissipation terms, coupled with the  $\hat{\psi}-\hat{\theta}$  inversion for the finite-depth model. The calculation is performed in the spectral domain, corresponding

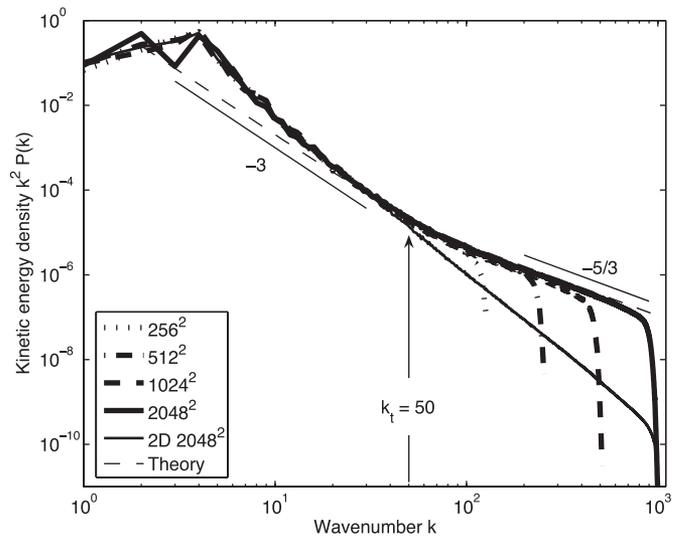


Fig. 1. fSQG kinetic energy spectra at  $z = 0$  with  $k_t = 50$ , computed at different horizontal resolutions. The thin solid line shows a calculation of regular 2D turbulence for reference, and the thin dashed line is the theoretical spectrum (Eq. 9), with constant chosen to match the large-scale spectra.

to a  $2\pi$ -periodic physical domain, by using a de-aliased fast Fourier transform method to calculate the nonlinear terms, by means of the staggered grid method of Orszag (32). Stirring is generated at  $k_f = 4$  by a random Markovian process that is highly correlated in time (so that the decorrelation time is longer than the eddy turnover time in the cascade). Large-scale dissipation of the inverse cascade is accomplished with a strong linear drag on temperature. The forward cascade of temperature variance is dissipated by using a highly scale-selective exponential cutoff. The filter is explicitly restricted to act only on  $k \geq 2k_{\max}/3$  but in fact affects a much smaller range of wavenumbers close to  $k_{\max}$ . The details of the filter are discussed in ref. 21. In all cases, the filter is sufficiently strong that the high-wavenumber spectrum is minimally influenced by the filter but strong enough to ensure that our effective Kolmogorov scale is resolved.

Fig. 1 shows a plot of the kinetic energy spectra  $k^2 \mathcal{P}(k)$  for a series of simulations performed at resolutions ranging from  $256^2$  ( $k_{\max} = 127$ ) to  $2,048^2$  ( $k_{\max} = 1,023$ ), all using  $\sigma = 1$  and  $H = 1/50$ , so that the input transition wavenumber is  $k_t = 50$ . Also shown for reference is the result of a simulation of standard 2D Euler turbulence, forced and dissipated identically to the other runs, performed at  $2,048^2$  resolution, and the theoretical spectrum, with constant chosen to match the large-scale spectra. The small-scale filter is adjusted for each simulation so that it acts only near the highest-resolved wavenumber, as explained above. Each spectrum was calculated by averaging over time (for the portion of the simulation over which the flow was in steady state) and azimuthal angle in the horizontal plane.

At large scales, all fSQG spectra follow the 2D Euler spectra. That said, all are steeper than a  $-3$  slope near the forcing scale, but this is not uncommon for the direct cascade range in 2D turbulence. The consistency at large scales between the fSQG and 2D Euler simulations indicates that deviations from  $-3$  at wavenumbers near the forcing scale reflect the forcing mechanism and intrinsic dynamics of forced 2D turbulence with drag, not the intrinsic dynamics of the fSQG model. The shallow slope for all fSQG runs at  $k > k_t$  approaches  $-5/3$ , as expected. Crucially, the series of simulations represented in Fig. 1 shows that the transition scale is independent of resolution and small-scale dissipation.

To check that the transition scale that arises from the simulation is truly proportional to the input transition wavenumber



ture spectrum at large scales, and so large-scale available potential and kinetic energy will be in equipartition, as observed. At scales smaller than the transition scale, fSQG predicts equipartition between potential and kinetic energy but also predicts that both will have spectra that are shallower and of larger amplitude than those generated by the interior flow. Thus, at small scales the energy generated by the surface-trapped cascade will emerge to dominate the spectra of both kinetic and potential energy [Held *et al.* (29) make a similar hypothesis in their conclusion]. Moreover, the emergence of the  $-5/3$  surface-trapped cascade may occur at smaller scales than  $k_t$  when the large scales are dominated by the  $-3$  interior dynamics, depending on the relative strength of the surface and interior forcing.

It may be the case that a continuously stratified quasigeostrophic model in which both lower and upper boundary tempera-

ture advection are explicitly taken into account (isothermal boundaries are used in most numerical quasigeostrophic models) would reveal a spectral signature quantitatively similar to that observed by NG85. Nevertheless, the consistency of the predictions for the observed mesoscale spectrum with or without significant interior flow anomalies is a satisfying feature of the simple model suggested here.

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