Benchmark calculations of radiative forcing by greenhouse gases

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Abstract

Changes in the concentration of greenhouse gases within the atmosphere lead to changes in radiative fluxes throughout the atmosphere. The value of this change, called the instantaneous radiative forcing, varies across climate models, due partly to differences in the distribution of clouds, humidity, and temperature across models, and partly due to errors introduced by approximate treatments of radiative transfer. This paper describes an experiment within the Radiative Forcing Model Intercomparision Project that uses benchmark calculations made with line-by-line models to identify parameterization error in the representation of absorption and emission by greenhouse gases. The clear-sky instantaneous forcing by greenhouse gases to which the world has been subject is computed using a set of 100 profiles, selected from a re-analysis of present-day conditions, that represent the global annual mean forcing with sampling errors of less than 0.01 \si{\watt\per\square\meter}}. Six contributing line-by-line models agree in their estimate of this forcing to within 0.025 \si{\watt\per\square\meter} while even recently-developed parameterizations have typical errors four or more times larger, suggesting both that the samples reveal true differences among line-by-line models and that parameterization error will be readily resolved. Agreement among line-by-line models is better in the longwave than in the shortwave where differing treatments of the water vapor vapor continuum affect estimates of forcing by carbon dioxide and methane. The impacts of clouds on instantaneous radiative forcing are roughly estimated, as are adjustments due to stratospheric temperature change. Adjustments are large only for ozone and for carbon dioxide, for which stratospheric cooling introduces modest non-linearity.

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| 18 | Key Points: |
|----|---|
| 19 | • Mean clear-sky instantaneous radiative forcing by greenhouse gases is computed |
| 20 | with six benchmark models using 100 atmospheric profiles. |
| 21 | • Sampling error is several times smaller than the level of disagreement among mod- |
| 22 | els, which is itself smaller than parameterization error. |
| 23 | • The impacts of clouds and stratospheric adjustment are roughly estimated; ad- |
| 24 | justments are large only for carbon dioxide and ozone. |

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25 Abstract

Changes in the concentration of greenhouse gases within the atmosphere lead to changes 26 in radiative fluxes throughout the atmosphere. The value of this change, called the in-27 stantaneous radiative forcing, varies across climate models, due partly to differences in 28 the distribution of clouds, humidity, and temperature across models, and partly due to 29 errors introduced by approximate treatments of radiative transfer. This paper describes 30 an experiment within the Radiative Forcing Model Intercomparision Project that uses 31 benchmark calculations made with line-by-line models to identify parameterization er-32 ror in the representation of absorption and emission by greenhouse gases. The clear-sky 33 instantaneous forcing by greenhouse gases to which the world has been subject is com-34 puted using a set of 100 profiles, selected from a re-analysis of present-day conditions, 35 that represent the global annual mean forcing with sampling errors of less than 0.01 Wm^{-2} . 36 Six contributing line-by-line models agree in their estimate of this forcing to within 0.025 37 $W m^{-2}$ while even recently-developed parameterizations have typical errors four or more 38 times larger, suggesting both that the samples reveal true differences among line-by-line 39 models and that parameterization error will be readily resolved. Agreement among line-40 by-line models is better in the longwave than in the shortwave where differing treatments 41 of the water vapor vapor continuum affect estimates of forcing by carbon dioxide and 42 methane. The impacts of clouds on instantaneous radiative forcing are estimated from 43 climate model simulations. The adjustment due to stratospheric temperature change by 44 assuming fixed dynamical heating. Adjustments are large only for ozone and for carbon 45 dioxide, for which stratospheric cooling introduces modest non-linearity. 46

⁴⁷ 1 Providing global-scale benchmarks for radiation parameterizations

One of the three questions motivating the sixth phase of the Coupled Model In-48 tercomparison Project (CMIP6, see Eyring et al., 2016) is "How does the Earth system 49 respond to forcing?" The degree to which this question can be addressed depends partly 50 on how well the forcing can be characterized. The measure most useful in explaining the 51 long-term response of surface temperature is the *effective radiative forcing*, defined as 52 change in radiative flux at the top of the atmosphere after accounting for adjustments 53 (changes in the opacity and/or temperature of the atmosphere not associated with mean 54 surface warming, see Sherwood et al., 2015). In support of CMIP6 the Radiative Forc-55 ing Model Intercomparison Project (RFMIP, see Pincus et al., 2016) characterizes the 56 forcing to which models are subject using "fixed-SST" experiments (Rotstayn & Pen-57 ner, 2001; Hansen, 2005) in which atmospheric composition and land use are varied but 58 the response of sea-surface temperature and sea ice concentrations is suppressed (Forster 59 et al., 2016). 60

The models participating in the previous phase of CMIP translated prescribed changes 61 in atmospheric composition into a relatively wide range of effective radiative forcing, much 62 of which remains even when model-specific adjustments are accounted for (e.g. Chung 63 & Soden, 2015); initial results (Smith, Kramer, Myhre, et al., 2020) suggest that this di-64 versity persists in CMIP6 models. Some of this variability is due a dependence on model 65 state, especially how model-specific distributions of clouds and water vapor mask the ra-66 diative impact of changes in greenhouse gas concentrations (e.g. Huang et al., 2016). Ad-67 ditional variability, however, is due to model error in the *instantaneous radiative forc*-68 ing, i.e. the change in flux in the absence of adjustments, as illustrated by comparisons that use prescribed atmospheric conditions to (Ellingson et al., 1991; Collins et al., 2006; 70 Oreopoulos et al., 2012; Pincus et al., 2015) to eliminate other causes of disagreement. 71

In an effort to untangle the contributions of state dependence and model error, RFMIP
 complements the characterization of effective radiative forcing with an assessment of er rors in computations of clear-sky instantaneous radiative forcing due to greenhouse gases
 and aerosols. This assessment, identified as experiment *rad-irf*, is possible because there

is little fundamental uncertainty. Using reference "line-by-line" models, atmospheric conditions and gas concentrations can be mapped to extinction with high fidelity at the very
fine spectral resolution needed to resolve each of the millions of absorption lines. Fluxes
computed with high spectral and angular resolution are then limited in precision primarily by uncertainty in inputs. These reference models are known to be in very good agreement with observations (e.g. Alvarado et al., 2013; Kiel et al., 2016), especially in the
absence of difficult-to-characterize clouds, given current knowledge of spectroscopy.

Previous assessments of radiative transfer parameterizations, focused on understand-83 ing the causes of error, have examined the response to perturbations around a small num-84 ber of atmospheric profiles. RFMIP builds on this long history by focusing on the global 85 scale relevant for climate modeling. As we explain below, we make this link by carefully 86 choosing a relatively small number of atmospheric states that nonetheless sample the con-87 ditions needed to determine global-mean clear-sky instantaneous radiative forcing by green-88 house gases. A number of reference modeling groups have provided fluxes for these sets 89 of conditions, providing both a benchmark against which parameterizations can be eval-90 uated and information as to how reasonable choices might affect those benchmarks given 91 current understanding. 92

Here we describe the line-by-line calculations made for RFMIP and exploit them 93 to move towards benchmark estimates of the true radiative forcing to which the earth 94 has been subject due to increases in well-mixed greenhouse gases. We describe the con-95 struction of a small set of atmospheric profiles that can be used to accurately reproduce 96 global-mean, annual-mean clear-sky instantaneous radiative forcing by greenhouse gases. 97 We summarize the reference calculations supplied to date and highlight the values of clear-98 99 sky instantaneous radiative forcing for a range of changes in atmospheric composition relative to pre-industrial conditions. We show that sampling error from the small set of 100 profiles is small enough that small differences among line-by-line calculations can be re-101 solved, while variance among reference models is still less than even modern parameter-102 ized treatments, suggesting the the experiments can identify true variability across line-103 by-line models and parameterization error. We then cautiously extend these benchmark 104 estimates towards more useful estimates that include the impact of clouds and adjust-105 ments. 106

¹⁰⁷ 2 Making global-mean benchmarks practical

Increasing computing power and more flexible software have made large-scale line-108 by-line calculations increasingly practical. Indeed RFMIP effort to diagnose errors in in-109 stantaneous radiative forcing by aerosols applies line-by-line modeling at relatively low 110 spectral resolution (Jones et al., 2017) to eight global snapshots for each participating 111 model. Errors in global mean, annual mean clear-sky instantaneous radiative forcing by 112 greenhouse gases, however, can be assessed with a much more parsimonious set of at-113 mospheric conditions. This is because temporal variations of temperature and water va-114 por are relatively slow and have a modest impact on the sensitivity of flux to changes 115 in greenhouse gas concentrations. Many previous calculations (see Etminan et al., 2016, 116 for a recent example), in fact, estimate global mean, annual mean values using just two 117 or three profiles, based on work in the 1990s showing that even such simple representa-118 tions of latitudinal variability are sufficient to constrain flux changes at the tropopause 119 to within about a percent (Freckleton et al., 1998; Myhre et al., 1998). 120

Here we describe the construction of a set of atmospheric profiles designed to determine *error* in global-mean clear-sky instantaneous radiative forcing, obtained using a reference model on a very large number of atmospheric and surface conditions to determine this forcing and choosing a subset of these conditions that minimizes the sampling error across a range of measures. As we demonstrate below, the same set of pro**Table 1.** Perturbations around present-day (PD) conditions used to identify representative profiles. These are similar to, but not the same as, the perturbations used in RFMIP experiment *rad-irf* for reasons described in the text. Perturbations are applied to each profile drawn from ERA-Interim profile set. Carbon dioxide concentrations are relative to a pre-industrial (PI) volume mixing ratio of 278 ppmv. GHG refers to well-mixed greenhouse gases.Temperature T and relative humidity RH perturbations (12, 13) use the average of two models from the CMIP5 archive (GFDL-CM3 and GFDL-ESM2G) with relatively low and high climate sensitivities, respectively.

| | Perturbation |
|----|---|
| 1 | PI $0.5 \times CO_2$ |
| 2 | PI $2 \times CO_2$ |
| 3 | PI $3 \times CO_2$ |
| 4 | PI $8 \times CO_2$ |
| 5 | PI CO_2 (278 ppmv) |
| 6 | PI CH_4 (0.722 ppmv) |
| 7 | PI N ₂ O (0.273 ppmv) |
| 8 | PI HFC (all HFC at zero) |
| 9 | PI O_3 (from CMIP6 PI ozone file) |
| 10 | $PD + 4K$ temperature, no H_2O change |
| 11 | PD + 20% humidity |
| 12 | PI T, RH, O_3 , GHG |
| 13 | 2095 RCP8.5 T, RH, O ₃ , GHG |
| 14 | $PI O_3, GHG$ |
| 15 | PI O ₃ , GHG, but PI $4 \times CO_2$ |
| 16 | $2095 \text{ Avg Sens RCP4.5 O}_3, \text{ GHG}$ |
| 17 | 2095 Avg Sens RCP8.5 O ₃ , GHG |

files also provides an accurate sample of the parameterization or approximation error in radiative forcing.

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2.1 Computing global-mean, annual mean radiative fluxes and flux perturbations

We characterize the range of conditions in the present-day atmosphere using a sin-130 gle year (2014) of the ERA-Interim reanalysis (Dee et al., 2011). We sample tempera-131 ture, pressure, specific humidity, ozone mixing ratios, and surface temperature and albedo 132 on a 1.5° grid every 10.25 days. Sampling at high latitudes is reduced to maintain roughly 133 equal area weighting. Concentrations of other greenhouse gases (CO₂, CH₄, N₂O, HCFCs 134 22 and 134a, CFCs 11, 12, and 113, and CCl₄) use 2014 values from NOAA greenhouse 135 gas inventories and are assumed to be spatially uniform. We assume that these 823,680 136 profiles adequately represent global-mean, annual-mean clear-sky conditions. 137

We apply a series of 17 perturbations (detailed in Table 2.1) to these conditions, including varying concentrations of greenhouse gases (especially CO₂), temperature, and humidity. Some temperature perturbations include spatial patterns obtained from climate change simulations made for CMIP5. The perturbations are intended to sample error across a wide range of conditions. The perturbations are similar to, but not quite the same as, those used by the final RFMIP experiments in Section 3, because the RFMIP protocol was not fully established when we performed these calculations.

Our aim is to reproduce the mean of a set of reference fluxes, fully resolved in space 145 and time and across the electromagnetic spectrum, computed for present-day conditions 146 and each perturbation. The fluxes are computed using the UK Met Office SOCRATES 147 (Suite Of Community RAdiative Transfer codes based on Edwards & Slingo, 1996) con-148 figured as a narrow-band model with a very high-resolution k-distribution with 300 bands 149 in the longwave and 260 bands in the shortwave (Walters et al., 2019). This configura-150 tion agrees quite well with line-by-line models (e.g. Pincus et al., 2015) and is one of the 151 benchmark models described in Section 3.1. The spectral overlap of gases is treated with 152 equivalent extinction with corrected scaling. Clouds and aerosols are not considered, con-153 sistent with the protocol for RFMIP experiment rad-irf. 154

We also compute fluxes for these sets of atmospheric conditions with an approximate model: RRTMG (Mlawer et al., 1997; Iacono et al., 2000), which is based on somewhat older spectroscopic information and so is expected to have errors with a potential dependence on atmospheric state.

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2.2 Choosing a set of globally-representative profiles

We seek a small subset of atmospheric profiles that minimizes sampling error in the 160 global, annual mean obtained from the full calculation. To identify such a subset we must 161 quantify what we mean by "best" by defining a cost or objective function with which 162 to measure sampling error. Because the goal of RFMIP is to establish accuracy in cal-163 culations of radiative forcing, our objective function O is defined in terms of the change 164 in flux between each of the 17 perturbations and present-day conditions. (For pertur-165 bations in which the only change is to greenhouse gas concentrations this quantity is pre-166 cisely the instantaneous radiative forcing.) The objective function includes errors in changes 167 of upward flux at the top of the atmosphere and downward flux at the surface as well 168 as changes in flux divergence above and below the tropopause (the level of which is de-169 termined by Wilcox et al., 2011); each quantity is computed for both longwave and short-170 wave fluxes. We guard against compensating errors related to temperature, humidity, 171 and surface albedo and emissivity by further considering 9 roughly equal-area latitude 172 bands centered on the equator. We choose an l^2 norm so that 173

$$O = \left[\frac{1}{N_{\text{lat}}N_{\text{pert}}N_{\text{quant}}}\sum_{l}^{N_{\text{lat}}}\sum_{p}^{N_{\text{pert}}}\sum_{q}^{N_{\text{quant}}}\left(\widehat{\Delta F}_{l,p,q} - \Delta F_{l,p,q}\right)^{2}\right]^{1/2}$$
(1)

where $\Delta F_{l,p,q}$ describes the average change in flux or flux divergence, as computed with the reference model over the full set of profiles, between perturbation p and present-day conditions in latitude band l for quantity q, and $\widehat{\Delta F}_{l,p,q}$ the sampled estimate of the same quantity. The objective function includes the four flux quantities for both longwave and shortwave fluxes $(N_{quant} = 8)$.

We identify optimal subsets of profiles from within the complete set using simu-179 lated annealing (Kirkpatrick et al., 1983). Because the optimization is stochastic we per-180 form 25 independent optimizations for each of a range of subset sizes. We save the re-181 alization with the lowest value of O although this choice has little impact as the stan-182 dard deviation across realizations is small (roughly 6% of the mean sampling error), so 183 that the sampling error in the best realization is only about 10% smaller than the mean 184 (Figure 1). Simulated annealing produces sampling errors substantially lower than purely 185 random sampling (by a factor of 19 for 100 profiles, not shown). The choice of profiles 186 is reasonably robust to the choice of model: sampling error in the independent estimate 187 of mean radiative forcing with RRTMG is only modestly larger (15% for 100 profiles) 188 than for calculations with the narrow-band configuration of SOCRATES. 189

Profiles chosen to minimize sampling error in mean radiative forcing also provide accurate estimates of parameterization error $\mathcal{E} = \Delta \tilde{F} - \Delta F$ in that forcing, where $\Delta \tilde{F}$



Figure 1. Left: values of the cost function O, an aggregate measure of error across regions, changes in atmospheric conditions, and measures of flux (Eq. 1) as a function of the number of optimal profiles. The simulated annealing method used to chose the profiles is stochastic; the mean and standard deviation across realizations is shown along with the value of sample error from the best-fit realization used in further calculations. The choice of profiles based on reference radiative transfer calculations ("SOCRATES") is robust, producing only modestly larger sampling errors for approximate calculations ("RRTMG"). Right: Absolute value of the sampling error $\hat{\mathcal{E}} - \mathcal{E}$ in estimates of the approximation error $\mathcal{E} = \Delta \tilde{F} - \Delta F$ sought by RFMIP. Errors shown are for the mean of 100 samples representing the global, annual mean, for changes in upwelling longwave flux at the top of the atmosphere (red) and downwelling shortwave flux at the surface (purple) from 17 perturbations. Parameterization errors range from 0 to about 0 to 0.6 W m⁻² in the global, annual mean; sampling error is almost always less than 0.01 W m⁻².

¹⁹² is a computation made with an approximate model. Fig. 1 shows the sampling error $\hat{\mathcal{E}}$ -¹⁹³ \mathcal{E} in estimates of the global, annual mean parameterization error for RRTMG compared ¹⁹⁴ to high-resolution SOCRATES calculations for the 17 perturbations used to develop the ¹⁹⁵ profile samples. True absolute errors from RRTMG range from near 0 to 0.6 W m⁻² in ¹⁹⁶ the global, annual mean; sampling error in these estimates is almost always less than 0.01 ¹⁹⁷ W m⁻².

The RFMIP protocol uses the set of 100 profiles with the lowest value of the objective function O. As a consequence of optimizing the sampling for radiative forcing, fluxes for any individual state including the present-day baseline are themselves subject to sampling errors: global mean insolation in our sample, for example, is 335.1 W m^{-2} (c.f. the true mean of $\sim 1361/4 = 340.25 \text{ W m}^{-2}$). In addition, using a single set of profiles for both longwave and shortwave calculations means that the sun is below the horizon for roughly half the set of profiles.

3 Radiation calculations with reference models

Experiment *rad-irf* requests fluxes for these 100 profiles and for 17 perturbations around present-day conditions, including changes in greenhouse gas concentrations, temperature, and humidity (see tables 3 and 4 in Pincus et al., 2016). Below we focus on the thirteen experiments in which gas concentrations alone are changed.

3.1 Contributions and variants

To date six benchmark models have contributed results: ARTS 2.3 (Buehler et al., 211 2018), provided by the University of Hamburg; LBLRTM v12.8 (Clough et al., 2005), 212 provided by Atmospheric and Environmental Research; the SOCRATES narrow-band 213 configuration described in Sec. 2.1, provided by the UK Met Office; the Reference For-214 ward Model (Dudhia, 2017), provided by the NOAA Geophysical Fluid Dynamics Lab; 215 GRTCODE, a new line-by-line code developed at GFDL; and 4AOP (Scott & Chédin, 216 1981; Chéruy et al., 1995), provided by the Laboratoire de Météorologie Dynamique. Half 217 the models use spectroscopic information from HITRAN 2012 (Rothman et al., 2013), 218 while GRTCODE results are based on HITRAN 2016 (Gordon et al., 2017), 4AOP uses 219 GEISA 2015 (Jacquinet-Husson et al., 2016), and LBLRTM employs the aer_v_3.6 line 220 file, which is based on HITRAN 2012 but includes small changes to improve comparisons 221 with select observations. With one exception noted below the models use variants of the 222 MT_CKD continuum (Mlawer et al., 2012). 223

These six models provide eighteen sets of longwave fluxes and nine sets of shortwave fluxes. This multiplicity arises because some models provided calculations for slightly different sets of greenhouse gases, called "forcing variants" within CMIP and RFMIP, and/or slightly different model configurations ("physics variants").

Climate models participating in CMIP6 may specify well-mixed greenhouse con-228 centrations using one of three forcing variants described by Meinshausen et al. (2017): 229 using some or all of the 43 greenhouse gases provided in the forcing data set; by prescrib-230 ing CO_2 , CH_4 , N_2O , CFC-12, and an "equivalent" concentration of CFC-11 to rep-231 resent all other gases; or using CO₂, CH₄, N₂O, and equivalent concentrations of CFC-11 232 and HFC-134 a. (Concentrations of water vapor and ozone are drawn from reanalysis, 233 as described in Sec. 2.1.) Some models provided results for more than one of these forc-234 ing variants. 235

In addition, some models provided calculations with slightly reconfigured models. ARTS 2.3 does not normally include CO₂ line mixing but provided a second physics variant that did so. High spectral resolution calculations with SOCRATES are themselves considered a second physics variant of the lower-resolution calculations made during simulations with the host model HadGEM; a third variant uses the MT_CKD 3.2 treatment of the water vapor continuum in lieu of the CAVIAR continuum used in the development of the parameterization.

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3.2 Instantaneous clear-sky forcing at present day

Figure 2 shows an example calculation of instantaneous radiative forcing: the change 244 in net downward flux at the top-of-atmosphere (TOA) and the surface, and the change 245 in net absorption across the atmosphere (net flux at TOA minus net at surface), here 246 for the change between present-day and pre-industrial conditions. Increased greenhouse 247 gas concentrations in the present day increase the opacity of the atmosphere. In the long-248 wave this acts to decrease outgoing longwave at the TOA and increase downward long-249 wave at the surface. The increase in downwelling surface radiation is smaller than the 250 decrease in outgoing longwave, resulting in decreased radiative cooling across the atmo-251 sphere. In the shortwave there a near-zero increase in scattering back to space but an 252 increase in atmospheric absorption, resulting in diminished solar radiation at the sur-253 face. 254

Agreement among the line-by-line models is excellent: the standard deviation across all six quantities (forcing at the top-of-atmosphere, with the atmosphere, and at the surface, for longwave and shortwave) is less than 0.025 W m^{-2} with the exception of LW absorption, where the standard deviation is 0.033 W m^{-2} . There is no systematic variation across forcing variants, indicating that the equivalent concentrations accurately sum-



Figure 2. Global, annual mean instantaneous clear-sky radiative forcing by greenhouse gases at present-day, relative to pre-industrial conditions, as computed by benchmark radiative transfer models. Longwave results are on the left, shortwave results on the right, with the reference model denoted by the color. Model names follow the RFMIP convention with contributions from SOCRATES labeled as HadGEM3 to link the results to the host climate model. Results include multiple representations of greenhouse gase changes (circles, squares, and diamonds corresponding to forcing variants 1, 2, and 3) and small variants in the treatment of some physical processes as explained in the text. All variants of the reference models agree well in longwave calculations, while SOCRATES results in the shortwave show the small but noticeable impact of different treatments of the H_2O continuum, which overlaps with absorption by other gases in the near-infrared and so affects forcing by those gases.

marize the radiative impact of the neglected gases in the transition from pre-industrial to present-day conditions.

Changes in shortwave flux between pre-industrial and present-day are substantially 262 smaller than in the longwave. The standard deviations are commensurate with those in 263 the longwave, but diversity in atmospheric absorption and surface forcing is dominated 264 by physics variant 2 of the SOCRATES code, which is unique among the models in us-265 ing the CAVIAR treatment for continuum absorption by water vapor (Ptashnik et al., 266 2011, 2013). Absorption in the near infrared in the CAVIAR continuum is substantially 267 larger than in the MT_CKD continuum on which all other models rely, especially where 268 water vapor absorption coincides with absorption lines of CO_2 , CH_4 and N_2O . This masks 269 changes in opacity due to well-mixed greenhouse gases and reduces the forcing at the sur-270 face between pre-industrial and present-day concentrations. 271

Global-mean values of clear-sky instantaneous radiative forcing for a range of wellmixed greenhouse gases, averaged across all available reference models, are provided in Table 3.2. Variability across models and forcing and physics variants, in both longwave and shortwave forcing calculations, increases with the magnitude of the forcing (Figure 3).

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3.3 Establishing a benchmark for parameterization error

Experiment *rad-irf* is intended to assess error in the parameterization of clear-sky radiation in the climate models participating in CMIP6. Resolving this error is only possible if the disagreement among benchmark models is small relative to the typical difference between a parameterization and the reference models themselves. (Sampling er-

Table 2. Instantaneous radiative forcing computed as the mean across all available benchmark models, forcing variants, and physics variants, in W m⁻². Forcing is defined as net downward flux under perturbed conditions minus net downward flux under pre-industrial (PI) conditions; because the profiles provided for experiment *rad-irf* are perturbed around present-day (PD) conditions the difference required may be indirect, as explained in the table. Values are provided for the top of the atmosphere (TOA) and surface (Sfc). RFMIP experiment *rad-irf* contains further perturbations meant to assess errors in temperature and humidity dependence.

| | LW TOA | LW Sfc | SW TOA | SW Sfc |
|--|---|--------|--------|--------|
| Experiment | | | | |
| Computed as difference fr | Computed as difference from perturbation "PI" | | | |
| Present-day | 2.830 | 2.040 | 0.055 | -0.455 |
| Future | 7.377 | 5.542 | 0.355 | -1.393 |
| Last Glacial Maximum | -2.384 | -1.416 | -0.065 | 0.316 |
| Computed as negative difference from perturbation "PD" | | | | |
| Present-day CO_2 | 1.308 | 0.929 | 0.029 | -0.165 |
| Present-day CH_4 | 0.613 | 0.275 | 0.055 | -0.242 |
| Present-day N_2O | 0.205 | 0.088 | 0.002 | -0.011 |
| Present-day O_3 | 0.129 | 0.325 | -0.032 | -0.033 |
| Present-day halocarbons | 0.534 | 0.393 | 0.000 | -0.001 |
| Computed as difference from perturbation "PI CO2" | | | | |
| $\frac{1}{2} \times CO_2$ | -2.695 | -1.790 | -0.050 | 0.274 |
| $2 \times CO_2$ | 2.709 | 1.978 | 0.064 | -0.367 |
| $3 \times CO_2$ | 4.302 | 3.260 | 0.110 | -0.629 |
| $4 \times CO_2$ | 5.436 | 4.252 | 0.146 | -0.840 |
| $8 \times CO_2$ | 8.201 | 7.035 | 0.252 | -1.442 |



Figure 3. Standard deviation in estimates of global-mean instantaneous radiative forcing by greenhouse gases as a function of the absolute value of mean forcing across 18 benchmark calculations in the longwave (red) and nine in the shortwave (purple). Top-of-atmosphere forcing is indicated with an upward-pointing triangle; forcing at the surface with a downward-pointing triangle. Only forcing at the surface is shown for the shortwave. Agreement across models, forcing variants, and model physics variants increases with the mean forcing but it roughly two orders of magnitude smaller than the mean forcing across longwave experiments. Shortwave experiments are a factor of 2-3 more variable, partly driven by different treatments of near-infrared water vapor continuum. The figure illustrates agreement with respect to changed greenhouse gas concentrations; perturbations in experiment rad-irf in which temperature and/or humidity changes are omitted.

ror is smaller than the difference across reference models: see Figure 1). Figure 4, which 282 compares error from two modern parameterizations to the variability across the refer-283 ence models, suggests that the benchmark calculation is likely to meet this goal. Results 284 are shown for forcing across all 17 perturbations in experiment rad-irf. Errors relative 285 to LBLRTM v12.8 are shown the for low spectral-resolution version of SOCRATES, as 286 used in the HadGEM model, and for the newly-developed RTE+RRTMGP code (Pin-287 cus et al., 2019) which is trained on calculations with LBLRTM v12.8. These parame-288 terizations use recent spectroscopic information and so are likely to be among the pa-289 rameterizations with the smallest error. Nonetheless the error in each parameterization 290 is almost always larger than the standard deviation across reference models, indicating 291 differences between parameterizations and all reference models are dominated by param-292 eterization error. 293

²⁹⁴ 4 Towards effective radiative forcing

RFMIP experiment *rad-irf* was designed to assess parameterization error but the benchmark calculations might also be exploited to refine knowledge of the radiative forcing experienced by Earth due to various composition changes. Two conceptually different steps are required, both of which are likely to make the estimate substantially less certain. One is accounting for the impact of clouds, which requires radiative calculations over the large range of imperfectly-characterized cloud properties. The other is account-



Figure 4. Absolute error in instantaneous radiative forcing (longwave at the top of atmosphere on the left, shortwave at the surface on the right) as computed by two parameterizations, both based on current spectroscopic information, as a function of amount of disagreement across the reference models. Results are shown for all available forcing and physics variants for each of the 17 perturbations in experiment *rad-irf*. Error is assessed relative to LBLRTM v12.8 on which the RTE+RRTMGP parameterization is trained, minimizing the error for this parameterization. Regardless of which model is used as the benchmark, however, the error in each parameterization exceeds the standard deviation of results from the reference models for a large majority of perturbations, indicating that the reference calculations reported here are accurate enough to resolve parameterization error.

ing for adjustments (see Section 1) which introduces conceptually more uncertain non radiative calculations. The long history of efforts to establish high-precision estimate of
 forcing by greenhouse gases (e.g., most recently, Myhre et al., 2006; Etminan et al., 2016)
 provides a point of reference for any efforts to leverage RFMIP calculations.

4.1 Accounting for clouds

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Clouds modulate radiative forcing by greenhouse gases by screening changes in con-306 centration behind the cloud. The degree to which clouds obscure greenhouse gas forc-307 ing depends primarily on the cloud optical depth (though longwave emissivity and short-308 wave reflectance and transmittance). Top of atmosphere forcing is also modulated by 309 surface properties and cloud top height or pressure; surface forcing is modulated by cloud 310 base height. Accounting for clouds in estimates of radiative forcing by greenhouse gases 311 requires characterizing the wide variation in these properties in space and time. Obser-312 vations from passive satellite sensors offer the best sampling of global variations but pro-313 vide much stronger constraints on the quantities that affect top-of-atmosphere forcing 314 than surface forcing. Previous efforts to establish benchmarks for radiative forcing (e.g. 315 Etminan et al., 2016; Myhre et al., 2006) have used two atmospheric profiles (see Sec. 316 2) each combined with three sets of representative cloud properties as observed by pas-317 sive satellite instruments. Sampling errors in the global, annual mean at the top of the 318 atmosphere are thought to be of order 1% although this error estimate has not been re-319 visited since the 1990s (Myhre & Stordal, 1997; Freckleton et al., 1998). Errors in cloud 320 impacts on surface forcing have not been assessed. 321

We hope to revisit this question in future work. One important question will be whether computational effort is better spent in sampling the co-variability of cloud properties with other atmospheric and surface properties or in high-spectral resolution cal**Table 3.** Ratio of all-sky to clear-sky instantaneous radiative forcing, at the top-of-atmosphere and the surface, across a range of models and experiments in CMIP6. Clear-sky and all-sky (including clouds) fluxes are computed using a second radiative transfer calculation in which the forcing agents are modified for diagnostics purposes. Results from HadGEM3 and IPSL-CM6A use diagnostic calculations requested for CFMIP in which CO₂ concentrations are quadrupled from pre-industrial values. Values from GFDL-CM4, performed for this work, are computed by setting forcing agents to pre-industrial values in three RFMIP fixed-SST integrations. Results from HadGEM3 are preliminary and may be revised before they are made publicly available. Shortwave forcing at the top of atmosphere is so small that inferences of cloud masking are quite uneven across models.

| experiment | HadGEM3-GC31-LL amip | IPSL-CM6A-LR historical | 4xCO2 | GFDL-CM4 GHG | anthro |
|------------|-------------------------|----------------------------|-------|-----------------|--------|
| LW TOA | 0.764 | 0.735 | 0.763 | 0.757 | 0.767 |
| LW SFC | 0.622 | 0.608 | 0.696 | 0.689 | 0.680 |
| SW SFC | 0.718 | 0.732 | 0.711 | 0.853 | 0.714 |

culations to limit approximation errors. These questions, though, are beyond the scope 325 of what can be accomplished with reference model calculations to rad-irf. As an alter-326 native we have examined the ratio of all-sky to clear-sky instantaneous radiative forc-327 ing by greenhouse gases in the few available simulations from CMIP6. The Cloud Feed-328 backs Model Intercomparison Project (Webb et al., 2017) requests, at low priority, cal-329 culations with CO_2 concentrations quadrupled from pre-industrial concentrations; two 330 models have made such calculations available at this writing (HadGEM3 for experiment 331 amip and IPSL-CM6A for experiment historical). We have also made diagnostic radi-332 ation calculations in GFDL's AM4 model (Zhao et al., 2018) using pre-industrial green-333 house gas concentrations during RFMIP "fixed-SST" experiments in which these con-334 centrations are normally held constant at present-day values; these follow the protocol 335 described by (Lin et al., 2017). 336

Results are provided in Table 4.1. A decade ago Andrews & Forster (2008) found 337 that the presence of clouds reduced longwave instantaneous radiative forcing from quadru-338 pled CO_2 concentrations by amounts ranging from 9 to 20%, depending on the model 339 (see their Table S2). As the distribution of clouds simulated by climate models has con-340 tinued to move closer to observations (e.g. Klein et al., 2013) the estimated impact on 341 top-of-atmosphere forcing has grown while the range across models and experiments has 342 decreased (in Table 4.1 it is 23.6% to 26.5%). Clouds have a similar impact on short-343 wave forcing at the surface and an even larger impact on longwave forcing at the sur-344 face, though weaker observational constraints on the vertical structure of clouds allow 345 for greater diversity across models. 346

347 348

4.2 Accounting for adjustments from temperature changes in the stratosphere

As explained in Section 1 the measure of forcing most closely related to temperature response is effective radiative forcing: the sum of the instantaneous radiative forcing, computable with robust radiative transfer models, and adjustments made by the physical climate system in the absence of surface temperature change (Sherwood et al., 2015). Adjustments, like forcing, result from a difference in two states and so are not directly observable. Many adjustments involve changes to circulations and clouds across a range of scales (e.g. Gregory & Webb, 2008; Bretherton et al., 2013; Merlis, 2015) and can only be assessed with dynamical models for which establishing benchmarks is impractical.

In the climate models used to assess the global magnitude and distributions of ad-357 justments, the dominant adjustment to greenhouse gas forcing is consistently the cool-358 ing of the stratosphere, partly because various tropospheric adjustments counteract each 359 other (e.g. Smith et al., 2018; Smith, Kramer, & Sima, 2020). This cooling was first noted 360 by Manabe & Wetherald (1967) and identified as an adjustment to longwave forcing by 361 Hansen et al. (1997). As Shine & Myhre (2020) explain, increased concentrations of well-362 mixed greenhouse gases increase both emission by the stratosphere and absorption of ra-363 diation emitted from the troposphere. If the background atmosphere is optically thick 364 in the spectral region in which the gas is active (e.g. for CO_2) additional warming from 365 tropospheric emission is small and the stratosphere cools, enhancing instantaneous forc-366 ing at the top of the atmosphere, but if the the background atmosphere is optically thin 367 (as for most halocarbons) the stratosphere may warm, damping the instantaneous forc-368 ing. 369

The magnitude of this adjustment can be computed to a good approximation by 370 assuming that dynamical heating in the stratosphere is fixed (Ramanathan & Dickin-371 son, 1979; Fels et al., 1980): computing the radiative cooling rate of the stratosphere un-372 der baseline (present-day) conditions, assuming that this cooling is balanced by dynam-373 ical heating, and then finding the temperature profile necessary to obtain the same net 374 cooling profile under changed greenhouse gas concentrations. We follow Myhre et al. (2006) 375 and Etminan et al. (2016) in supplying this first-order estimate of adjustments. We com-376 pute the adjustment caused by stratospheric temperature re-equilibration, assuming fixed 377 dynamical heating, by iterating with GRTCODE model at reduced spectral resolution 378 until radiative heating rates reach their values in the present-day atmosphere. The cal-379 culations assume a uniform trop pause pressure of 200 Pa and account for changes in 380 both longwave and shortwave heating rates. For well-mixed greenhouse gases the impact 381 of stratospheric temperature adjustment depends primarily on the spectral region in which 382 the gas absorbs. 383

The impact of stratospheric temperature adjustment, expressed as the ratio of the change in flux due to temperature equilibration to the instantaneous longwave radiative forcing, is shown for a range of concentrations at present-day relative to pre-industrial conditions in Table 4.2. Stratospheric temperature changes from well-mixed greenhouse gases amplify (CO_2, N_2O) or damp $(CH_4, halocarbons)$ forcing at the top of the atmosphere; for all gases but CO_2 the impact is just a few percent. Surface forcing is damped by a similar amount.

Carbon dioxide is a notable exception: the amplification of top-of-atmosphere forc-391 ing at present-day is more than 55%. This large adjustment occurs because the total forc-392 ing at the top-of-the-atmosphere is a balance between contributions from distinct spec-393 tral regions. Near the center of the 15 μ m absorption band of CO₂ the atmosphere is op-394 tically thick and emission to space occurs in the stratosphere; increases CO_2 concentra-395 tions tends to increase outgoing longwave radiation because stratospheric temperature 396 increases with height. Away from the band center the atmosphere is optically thin, emis-397 sion is from the troposphere, and increasing concentrations acts to decrease outgoing long-308 wave radiation. Net forcing is negative (see Table 3.2) because the the tropospheric con-399 tribution dominates. Stratospheric cooling damps the instantaneous forcing from the band 400 center, allowing the optically-thin regions to dominate the change in top-of-atmosphere 401 flux even more effectively. The adjustment also increases by 1.8% per W m⁻² (Figure 402 5) so that effective radiative forcing may be modestly super-logarithmic in CO_2 concen-403 trations even though the instantaneous radiative forcing is nearly perfectly logarithmic. 404

405 Stratospheric temperature adjustment nearly doubles the top-of-atmosphere instan-406 taneous forcing from ozone but for quite different reasons. Ozone concentrations at present**Table 4.** Ratio of adjustment due to stratospheric temperature equilibration under the fixed dynamical heating assumption to instantaneous clear-sky longwave radiative forcing at the top of atmosphere and the surface for a range of forcing agents. Both forcing and stratospheric adjustment are computed using GFDL GRTCODE line-by-line model. Shortwave adjustments are all essentially zero.

| Experiment | TOA | SFC |
|-------------------------|-------|-------|
| Present-day | 0.31 | -0.03 |
| Present-day CO_2 | 0.57 | -0.05 |
| Present-day CH_4 | -0.05 | 0.01 |
| Present-day N_2O | 0.03 | -0.01 |
| Present-day O_3 | 1.90 | -0.06 |
| Present-day halocarbons | -0.11 | 0.01 |

day vary substantially in the vertical, peaking in the stratosphere. As one consequence 407 ozone acts to heat the stratosphere near the center of the 10 µm band and increases in 408 ozone concentration in either the troposphere or stratosphere tend to decrease net ra-409 diation at the top of the atmosphere. The vertical distribution of change is also non-uniform: 410 relative to pre-industrial conditions ozone concentrations have increased in the tropo-411 sphere but decreased in the stratosphere. The modest positive forcing from present-day 412 ozone relative to pre-industrial conditions results from a slightly larger decrease in out-413 going radiation from tropospheric emission than can be balanced by increased emission 414 from concentration reductions in the stratosphere. The stratosphere cools modestly de-415 spite because reduced concentrations of ozone because decreases in absorption of short-416 wave radiation are larger than the increases from enhanced longwave emission. This cool-417 ing, too, reduces the stratospheric contribution to forcing. Stratospheric adjustment of 418 ozone is larger than for carbon dioxide, in a relative sense, only because the balance be-419 tween stratosphere and troposphere is more even for instantaneous forcing. 420

5 Constraints on radiative forcing

Previous work (e.g. Chung & Soden, 2015; Soden et al., 2018) has established that 422 the instantaneous radiative forcing for a given change in atmospheric composition can 423 vary widely among climate models. This diversity has two distinct sources: parameter-424 ization error and variety in the distributions of temperature, humidity, and clouds be-425 tween models. By using accurate models across a representative set of observed condi-426 tions we have shown that the true value of clear-sky instantaneous radiative forcing can 427 be determined quite precisely, with all-sky estimates limited primarily by challenges in 428 representing the co-variability of clouds and atmospheric state. This highlights the distinction between climate model diversity and true uncertainty in estimates of instanta-430 neous radiative radiative forcing. Adjustments arising from greenhouse gas forcing, how-431 ever, remain a currently-irreducible source of uncertainty in attempts to estimate the true 432 effective radiative forcing to which our planet has been subject and a source of poorly-433 constrained diversity among model estimates of effective radiative forcing. 434

Two caveats apply to our estimates of clear-sky instantaneous radiative forcing. First, RFMIP explores parameterization error in perturbations around present-day conditions, so that our estimates of instantaneous radiative forcing are based on present-day distributions of temperature and humidity. Forcing depends modestly on both quantities (Huang et al., 2016) so our estimates of forcing are slightly enhanced relative to calculations that use pre-industrial conditions. Second, in the interests of highlighting model error in the representation of absorption by gases, the *rad-irf* protocol specifies spectrally-constant



Figure 5. Ratio of stratospheric temperature adjustment to instantaneous radiative forcing at the top of the atmosphere for CO_2 perturbations ranging from $0.5 \times$ to $8 \times$ pre-industrial concentrations. Assuming that heating from atmospheric dynamic stays constant allows the computation of a new equilibrium temperature profile to be computed; this profile is colder (because the stratosphere is a more effective emitter) so the adjustment amplifies instantaneous radiative forcing. The magnitude of the adjustment depends modestly on the magnitude of the forcing itself, suggesting that effective radiative forcing by CO_2 may be slightly super-logarithmic in concentration even if the instantaneous radiative forcing is not.

- surface albedo and emissivity as obtained from ERA-Interim. Shortwave forcing at the top of the atmosphere, which arises from the sensitivity to greenhouse gases of radiation reflected at the surface and transmitted through the atmosphere, can be dramatically overestimated if the surface albedo is overestimated in the spectral range affected by a given gas (Oreopoulos et al., 2012). The small values of shortwave forcing in Table 3.2 suggest that the simple treatment of surface albedo is not likely to cause a large error but accounting for spectral variations in surface albedo would be a useful exercise.
- The agreement in global-mean instantaneous radiative among reference models, though 449 encouraging, is consistent with almost 30 years of experience: Ellingson et al. (1991), for 450 example, report that most of their line-by-line results for flux agree to within 1%. The 451 agreement arises partly because radiative forcing, as the difference between two calcu-452 lations, is also less sensitive to assumptions or subtle differences between models because 453 many variations cancel out (Mlynczak et al., 2016). In our data set, however, the level 454 of agreement in fluxes across models at the atmosphere's boundaries under present-day 455 conditions varies by less than $0.6 \mathrm{W m^{-2}}$ in the longwave and $0.7 \mathrm{W m^{-2}}$ in the short-456 wave - smaller than the variability in forcing estimates, in a relative sense, by an order 457 of magnitude. The agreement in both fluxes and forcing arises because the models rely 458 on the same underlying physics applied to small variants around the same spectroscopic 459 data, so that the accuracy is limited by current spectroscopic knowledge more than by 460 the ability to calculate fluxes from that knowledge. So while spectroscopic knowledge 461 is now demonstrably more complete than it was 30 years ago (Mlawer & Turner, 2016), 462 small variations in forcing estimates – high precision – should be understood as being 463 conditioned on this knowledge rather than evidence of true accuracy. 464

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476 Data availability

All results for RFMIP experiment *rad-irf* are available on the Earth System Grid 477 Federation (searching for the experiment name is an effective way to find the data). Python 478 scripts and Jupyter notebooks to produce the paper are available at https://github 479 .com/RobertPincus/rfmip-benchmark-paper-figures and will be archived at Zenodo, 480 with a DOI, on acceptance. ERA-Interim data were obtained from https://www.ecmwf 481 .int/en/forecasts/datasets/archive-datasets/reanalysis-datasets/era-interim. 482 SOCRATES is available from https://code.metoffice.gov.uk/trac/socrates un-483 der an open source license but requires a free account from the UK Met Office to access 484 the website. Preliminary data for Table 4.1 were provided by Tim Andrews and Alejan-485 dro Bodas-Salcedo of the UK Met Office but will be derivable through data provided on 486 the Earth System Grid. 487

488 References

- Alvarado, M. J., Payne, V. H., Mlawer, E. J., Uymin, G., Shephard, M. W., CadyPereira, K. E., ... Moncet, J. L. (2013). Performance of the Line-By-Line Radiative Transfer Model (LBLRTM) for temperature, water vapor, and trace gas
- retrievals: Recent updates evaluated with IASI case studies. Atmos. Chem. Phys., 13(14), 6687–6711.
- Andrews, T., & Forster, P. M. (2008, February). CO ₂ forcing induces semi-direct
 effects with consequences for climate feedback interpretations. *Geophys. Res. Lett.*,
 35(4), L04802. doi: 10.1029/2007GL032273
- Bretherton, C. S., Blossey, P. N., & Jones, C. R. (2013, May). Mechanisms of
 marine low cloud sensitivity to idealized climate perturbations: A single-LES exploration extending the CGILS cases. J. Adv. Model. Earth Syst., 5(2), 316–337.
- doi: 10.1002/jame.20019
- ⁵⁰¹ Buehler, S. A., Mendrok, J., Eriksson, P., Perrin, A., Larsson, R., & Lemke, O.
- (2018, January). ARTS, the Atmospheric Radiative Transfer Simulator version
 2.2, the planetary toolbox edition. *Geosci. Model Dev.*, 11(4), 1537–1556. doi:
 10.5194/gmd-11-1537-2018
- Chéruy, F., Scott, N., Armante, R., Tournier, B., & Chedin, A. (1995, June). Contribution to the development of radiative transfer models for high spectral resolution observations in the infrared. *Journal of Quantitative Spectroscopy and Radiative Transfer*, 53(6), 597–611. doi: 10.1016/0022-4073(95)00026-H
- ⁵⁰⁹ Chung, E.-S., & Soden, B. J. (2015, January). An assessment of methods for computing radiative forcing in climate models. *Environ. Res. Lett.*, 10(7), 074004. doi: 10.1088/1748-9326/10/7/074004
- ⁵¹² Clough, S. A., Shephard, M. W., Mlawer, E. J., Delamere, J. S., Iacono, M. J.,
- ⁵¹³ Cady-Pereira, K., ... Brown, P. D. (2005, March). Atmospheric radiative transfer ⁵¹⁴ modeling: A summary of the AER codes. J. Quant. Spectrosc. Radiat. Transfer,

- 91(2), 233–244. doi: 10.1016/j.jqsrt.2004.05.058 515 Collins, W. D., Ramaswamy, V., Schwarzkopf, M. D., Sun, Y., Portmann, R. W., Fu, 516 Q.,... Zhong, W. Y. (2006, July). Radiative forcing by well-mixed greenhouse 517 gases: Estimates from climate models in the Intergovernmental Panel on Climate 518 Change (IPCC) Fourth Assessment Report (AR4). J. Geophys. Res., 111(D14), 519 D14317. 520 Dee, D. P., Uppala, S. M., Simmons, A. J., Berrisford, P., Poli, P., Kobayashi, S., 521 ... Vitart, F. (2011, January). The ERA-Interim reanalysis: Configuration and 522 performance of the data assimilation system. Quart. J. Royal Met. Soc., 137(656), 523 553–597. doi: 10.1002/qj.828 524 Dudhia, A. (2017, January). The Reference Forward Model (RFM). J. Quant. Spec-525 trosc. Radiat. Transfer, 186, 243-253. doi: 10.1016/j.jqsrt.2016.06.018 526 Edwards, J. M., & Slingo, A. (1996, April). Studies with a flexible new radiation 527 code. I: Choosing a configuration for a large-scale model. Quart. J. Royal Met. 528 Soc., 122(531), 689-719. doi: 10.1002/qj.49712253107 529 Ellingson, R. G., Ellis, J., & Fels, S. (1991). The intercomparison of radiation codes 530 used in climate models: Long wave results. J. Geophys. Res., 96(D5), 8929–8953. 531 Etminan, M., Myhre, G., Highwood, E. J., & Shine, K. P. (2016, December). Radia-532 tive forcing of carbon dioxide, methane, and nitrous oxide: A significant revision 533 of the methane radiative forcing. Geophys. Res. Lett., 43(24), 12,614–12,623. doi: 534 10.1002/2016GL071930 535 Evring, V., Bony, S., Meehl, G. A., Senior, C. A., Stevens, B., Stouffer, R. J., & 536 (2016, May). Overview of the Coupled Model Intercomparison Taylor, K. E. 537 Project Phase 6 (CMIP6) experimental design and organization. Geosci. Model 538 Dev., 9(5), 1937-1958.Fels, S. B., Mahlman, J. D., Schwarzkopf, M. D., & Sinclair, R. W. (1980. Octo-540 ber). Stratospheric Sensitivity to Perturbations in Ozone and Carbon Dioxide: 541 J. Atmos. Sci., 37(10), 2265-2297. Radiative and Dynamical Response. doi: 542 10.1175/1520-0469(1980)037(2265:SSTPIO)2.0.CO;2 543 Forster, P. M., Richardson, T., Maycock, A. C., Smith, C. J., Samset, B. H., Myhre, 544 G., ... Schulz, M. (2016, October). Recommendations for diagnosing effective 545 radiative forcing from climate models for CMIP6. J. Geophys. Res., 121(20), 546 12,460–12,475. doi: 10.1002/2016JD025320 547 Freckleton, R. S., Highwood, E. J., Shine, K. P., Wild, O., Law, K. S., & Sanderson, 548 Greenhouse gas radiative forcing: Effects of averaging and M. G. (1998, July). 549 Quart. J. Royal Met. Soc., 124(550), inhomogeneities in trace gas distribution. 550 2099–2127. doi: 10.1002/qj.49712455014 551 Gordon, I. E., Rothman, L. S., Hill, C., Kochanov, R. V., Tan, Y., Bernath, P. F., 552 Zak, E. J. (2017, January). The HITRAN2016 molecular spectroscopic 553 database. J. Quant. Spectrosc. Radiat. Transfer, 203, 3–69. 554 (2008, January). Gregory, J., & Webb, M. Tropospheric Adjustment In-555 duces a Cloud Component in CO2 Forcing. J. Climate, 21(1), 58–71. doi: 556 10.1175/2007JCLI1834.1 557 Hansen, J. (2005, January). Efficacy of climate forcings. J. Geophys. Res., 558 110(D18), 1042. doi: 10.1029/2005JD005776 559 Hansen, J., Sato, M., & Ruedy, R. (1997, March). Radiative forcing and climate re-560 sponse. J. Geophys. Res., 102(D6), 6831–6864. doi: 10.1029/96JD03436 561 Huang, Y., Tan, X., & Xia, Y. (2016, March). Inhomogeneous radiative forcing of 562 homogeneous greenhouse gases: Inhomogeneous Forcing of Homogeneous Gas. J. 563 Geophys. Res. Atmos., 121(6), 2780–2789. doi: 10.1002/2015JD024569 564 Iacono, M. J., Mlawer, E. J., Clough, S. A., & Morcrette, J.-J. (2000, June). Im-565 pact of an improved longwave radiation model, RRTM, on the energy budget and 566 thermodynamic properties of the NCAR community climate model, CCM3. J. 567
- Geophys. Res., 105 (D11), 14873-14890. doi: <math>10.1029/2000 JD900091

- Jacquinet-Husson, N., Armante, R., Scott, N., Chédin, A., Crépeau, L., Boutam-569 mine, C., ... Makie, A. (2016, September). The 2015 edition of the GEISA 570 spectroscopic database. Journal of Molecular Spectroscopy, 327, 31–72. doi: 571 10.1016/j.jms.2016.06.007 572 Jones, A. L., Feldman, D. R., Freidenreich, S., Paynter, D., Ramaswamy, V., Collins, 573 A New Paradigm for Diagnosing Con-W. D., & Pincus, R. (2017, December).574 tributions to Model Aerosol Forcing Error. Geophys. Res. Lett., 44(23), 12,004-575 12,012. 576 Kiel, M., Wunch, D., Wennberg, P. O., Toon, G. C., Hase, F., & Blumenstock, T. 577 (2016, January). Improved retrieval of gas abundances from near-infrared solar 578 FTIR spectra measured at the Karlsruhe TCCON station. Atmos. Meas. Tech., 579 9(2), 669-682. doi: 10.5194/amt-9-669-2016 580 Kirkpatrick, S., Gelatt, C. D., & Vecchi, M. P. (1983, May). Optimization by Simu-581 lated Annealing. Science, 220(4598), 671-680. doi: 10.1126/science.220.4598.671 582 Klein, S. A., Zhang, Y., Zelinka, M. D., Pincus, R., Boyle, J., & Gleckler, P. J. 583 (2013, February). Are climate model simulations of clouds improving? An eval-584 uation using the ISCCP simulator. J. Geophys. Res., 118(3), 1329–1342. doi: 585 10.1002/jgrd.50141 586 Lin, P., Paynter, D., Ming, Y., & Ramaswamy, V. (2017, February). Changes of 587 the Tropical Tropopause Layer under Global Warming. Journal of Climate, 30(4), 588 1245–1258. doi: 10.1175/JCLI-D-16-0457.1 589 Manabe, S., & Wetherald, R. T. (1967, May). Thermal Equilibrium of the At-590 mosphere with a Given Distribution of Relative Humidity. J. Atmos. Sci., 24(3), 591 241-259. doi: 10.1175/1520-0469(1967)024(0241:TEOTAW)2.0.CO;2 592 Meinshausen, M., Vogel, E., Nauels, A., Lorbacher, K., Meinshausen, N., Etheridge, D. M., \ldots Weiss, R. (2017, May). Historical greenhouse gas concentrations for 594 climate modelling (CMIP6). Geosci. Model Dev., 10(5), 2057–2116. 595 Merlis, T. M. (2015, October). Direct weakening of tropical circulations from 596 masked CO₂ radiative forcing. Proc Natl Acad Sci USA, 112(43), 13167. 597 Mlawer, E. J., Payne, V. H., Moncet, J. L., Delamere, J. S., Alvarado, M. J., & To-598 (2012, April). Development and recent evaluation of the MTCKD bin. D. C. 599 model of continuum absorption. Phil. Trans. Royal Soc. A, 370(1968), 2520–2556. 600 doi: 10.1021/jp710066f 601 Mlawer, E. J., Taubman, S. J., Brown, P. D., Iacono, M. J., & Clough, S. A. (1997, 602 Radiative transfer for inhomogeneous atmospheres: RRTM, a validated July). 603 correlated-k model for the longwave. J. Geophys. Res., 102(D14), 16663–16682. 604 doi: 10.1029/97JD00237 605 Mlawer, E. J., & Turner, D. D. (2016, April). Spectral Radiation Measurements and 606 Analysis in the ARM Program. *Meteorological Monographs*, 57, 14.1-14.17. doi: 607 10.1175/AMSMONOGRAPHS-D-15-0027.1 608 Mlynczak, M. G., Daniels, T. S., Kratz, D. P., Feldman, D. R., Collins, W. D., 609 Mlawer, E. J., ... Mast, J. C. (2016, May). The spectroscopic foundation of 610 radiative forcing of climate by carbon dioxide. Geophys. Res. Lett., 43(10), 5318-611 5325. doi: 10.1002/2016GL068837 612 Myhre, G., Highwood, E. J., Shine, K. P., & Stordal, F. (1998, July). New estimates 613 of radiative forcing due to well mixed greenhouse gases. Geophys. Res. Lett., 614 25(14), 2715–2718. doi: 10.1029/98GL01908 615 Myhre, G., & Stordal, F. (1997, May). Role of spatial and temporal variations in the 616 computation of radiative forcing and GWP. J. Geophys. Res., 102(D10), 11181-617 11200. doi: 10.1029/97JD00148 618 Myhre, G., Stordal, F., Gausemel, I., Nielsen, C. J., & Mahieu, E. (2006). Line-by-619 line calculations of thermal infrared radiation representative for global condition: 620 CFC-12 as an example. J. Quant. Spectrosc. Radiat. Transfer, 97(3), 317–331. 621
- Oreopoulos, L., Mlawer, E., Delamere, J., Shippert, T., Cole, J., Fomin, B., ...

| 623 | Rossow, W. B. (2012, March). The Continual Intercomparison of Radi- |
|-----|--|
| 624 | ation Codes: Results from Phase I. J. Geophys. Res., 117, D06118. doi: |
| 625 | 10.1029/2011JD016821 |
| 626 | Pincus, R., Forster, P. M., & Stevens, B. (2016, January). The Radiative Forc- |
| 627 | ing Model Intercomparison Project (RFMIP): Experimental protocol for CMIP6. |
| 628 | Geosci. Model Dev., 9, 3447–3460. doi: 10.5194/gmd-9-3447-2016 |
| 629 | Pincus, R., Mlawer, E. J., & Delamere, J. S. (2019). Balancing Accuracy, Efficiency, |
| 630 | and Flexibility in Badiation Calculations for Dynamical Models J. Adv. Model |
| 631 | Earth Sust. $6(11)$, $3074-3089$, doi: $10.1029/2019MS001621$ |
| 632 | Pincus R Mlawer E I Oreopoulos I. Ackerman A S Baek S Brath M |
| 632 | Schwarzkopf D M (2015 July) Radiative flux and forcing parameterization |
| 624 | error in aerosol-free clear skies Geonbus Res Lett $\sqrt{2}(13)$ 5485–5492 doi: |
| 635 | 101002/2015 GL 064291 |
| 635 | Ptashnik I V McPheat R Λ Shine K P Smith K M & Williams R C |
| 636 | (2011 August) Water vapor self continuum absorption in near infrared windows |
| 637 | derived from laboratory measurements I. Computer Res. 116(D16) 488 doi: |
| 638 | 10 1020/2011 ID015603 |
| 039 | Dtachnil IV Detrove T M Denomeney V N Shine K D Seleder A A & |
| 640 | Solodov A. M. (2013 May) Noar infrared water vapour self continuum at close |
| 641 | to room tomporature I Quant Spectrosc Radiat Transfer 190 23-35 doi: |
| 642 | 10 1016/j joset 2013 02 016 |
| 643 | Demonstran V & Dickingon P E (1070 June) The Dole of Strategyheric Ogono |
| 644 | in the Zenel and Sessenal Padiative Energy Palance of the Earth Transgradere |
| 645 | In the Zonar and Seasonar Radiative Energy Darance of the Earth-Troposphere System $I_{\rm eff}$ (4.102) $26/6$ (1024) $104/6$ (1020) $26/1024$ |
| 646 | System: J. Atmos. Sci., $50(0)$, $1064-1104$. doi: $10.1175/1520-0409(1979)050(1064)$. |
| 647 | Dethman I. S. Canden I. F. Debiley, V. Denha A. Chuis Dennen D. Denneth |
| 648 | D. F. Warman C. (2012 Nevershar) The IIITD AN2012 melocular grad |
| 649 | troggopie detabase I Quant Spectrose Padiet Transfer 120(0) 4 50 doi: |
| 650 | $10 \ 1016 \ /;$ icent 2012 07 002 |
| 651 | Deteterer I. D. & Dennen I. E. (2001 Index) Indirect Assess Erreiner Order Erre |
| 652 | ing and Climate Decourse I. Climate 1/(12) 2060 2075 doi: 10.1175/1520 |
| 653 | 10.1173/1520 |
| 654 | -0442(2001)014(2900.1AFQFA/2.0.00,2) |
| 655 | Scott, N. A., & Chedin, A. (1981). A last line-by-line method for atmospheric ab- |
| 656 | sorption computations: The Automatized Atmospheric Absorption Atlas. Jour- |
| 657 | $Mai \ 0 \ Appliea \ Meleorology, 20, 802-812.$ doi: $10.1175/1520-0450(1981)020(0802.$ |
| 658 | Chammed S.C. Denne S. Deuchen O. Brothenton C. Feneter D.M. Crearen |
| 659 | I. M. & Stavang, D. (2015, January) Adjustments in the faming feedback frame |
| 660 | J. M., & Stevens, B. (2015, January). Adjustments in the forcing-feedback frame- |
| 661 | doi: 10.1175 /DAMS D 12.00167.1 |
| 062 | Goin IV. II. 10/ DANIO-D-10-00101.1 Shina K D & Muhra C (2000 March) The Creatural Nature of Circter Levie |
| 663 | Temperature Adjustment and its Application to Heleconhon Dedictive Fereing |
| 664 | Temperature Aujustment and its Application to naiocarbon radiative Forcing. J. Adv. Model Facth Suct. $10(3)$, doi: 10.1020/2010MC001051 |
| 665 | Auv. Model. Earth Syst., $12(5)$. doi: $10.1029/2019$ MS001951 |
| 666 | Simili, O. J., Kramer, K. J., Mynre, G., Alterskjær, K., Collins, W., Sima, A., Forster, D. M. (2020) Effective redictive forcing and dimensional editors and a dimensional editor. |
| 667 | Forster, P. M. (2020). Effective radiative forcing and adjustments in CMIPO |
| 668 | 10 5104 / app 2010 1212 |
| 669 | 10.0194/acp-2019-1212 |
| 670 | Smith, U. J., Kramer, R. J., Myhre, G., Forster, P. M., Soden, B. J., Andrews, T., |
| 671 | watson-Parris, D. (2018, November). Understanding Rapid Adjustments |
| 672 | to Diverse Forcing Agents. Geophys. Kes. Lett., $45(21)$, $12,023-12,031$. doi: 10.1020/2019/CL070826 |
| 673 | 10.1029/2018 GL0/9820 |
| 674 | Smith, C. J., Kramer, R. J., & Sima, A. (2020, March). The HadGEM3-GA7.1 ra- |
| 675 | diative kernel: The importance of awell-resolved stratosphere. Earth System Sci- |
| 676 | ence Data Discussions. doi: $10.5194/essd-2019-254$ |

- Soden, B. J., Collins, W. D., & Feldman, D. R. (2018, July). Reducing uncertainties
 in climate models. *Science*, 361(6400), 326–327. doi: 10.1126/science.aau1864
- Walters, D., Baran, A. J., Boutle, I., Brooks, M., Earnshaw, P., Edwards, J., ...
- Zerroukat, M. (2019, January). The Met Office Unified Model Global Atmosphere
 7.0/7.1 and JULES Global Land 7.0 configurations. *Geosci. Model Dev.*, 12(5),
 1909–1963. doi: 10.5194/gmd-12-1909-2019
- Webb, M. J., Andrews, T., Bodas-Salcedo, A., Bony, S., Bretherton, C. S., Chad-
- wick, R., ... Watanabe, M. (2017, January). The Cloud Feedback Model Inter comparison Project (CFMIP) contribution to CMIP6. Geosci. Model Dev., 10(1),
 359–384. doi: 10.5194/gmd-10-359-2017
- Wilcox, L. J., Hoskins, B. J., & Shine, K. P. (2011, October). A global blended
 tropopause based on ERA data. Part I: Climatology. *Quart. J. Royal Met. Soc.*,
 138(664), 561–575. doi: 10.1002/qj.951
- ⁶⁹⁰ Zhao, M., Golaz, J.-C., Held, I. M., Guo, H., Balaji, V., Benson, R., ... Xiang, B.
- ⁶⁹¹ (2018, March). The GFDL Global Atmosphere and Land Model AM4.0/LM4.0:
- ⁶⁹² 2. Model Description, Sensitivity Studies, and Tuning Strategies. J. Adv. Model.
- Earth Syst., 10(3), 735–769. doi: 10.1002/2017MS001209