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A simple framework for assessing the trade-off between the climate impact of aviation carbon dioxide emissions and contrails for a single flight

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Abstract

Persistent contrails are an important climate impact of aviation which could potentially be reduced by re-routing aircraft to avoid contrailing; however this generally increases both the flight length and its corresponding CO_2 emissions. Here, we provide a simple framework to assess the trade-off between the climate impact of CO_2 emissions and contrails for a single flight, in terms of the absolute global warming potential and absolute global temperature potential metrics for time horizons of 20, 50 and 100 years. We use the framework to illustrate the maximum extra distance (with no altitude changes) that can be added to a flight and still reduce its overall climate impact. Small aircraft can fly up to four times further to avoid contrailing than large aircraft. The results have a strong dependence on the applied metric and time horizon. Applying a conservative estimate of the uncertainty in the contrail radiative forcing and climate efficacy leads to a factor of 20 difference in the maximum extra distance that could be flown to avoid a contrail. The impact of re-routing on other climatically-important aviation emissions could also be considered in this framework.

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1. Introduction

Persistent contrails are a climate impact of aviation whose radiative forcing may be comparable with that from aviation carbon dioxide (CO_2) emissions (Burkhardt and Kärcher 2011). There are few viable technological options for reducing contrail formation (Haglind 2008, Gierens et al 2008), meaning that the easiest way of mitigating this climate impact is to avoid routing aircraft through regions where contrails can form. As the ice-supersaturated regions (ISSRs) where contrails form frequently occur in relatively shallow layers (Rädel and Shine 2007), much of the previous work in this area has concentrated on avoiding contrail formation by altitude changes (Williams et al 2002, Fichter et al 2005, Mannstein et al 2005, Rädel and Shine 2008, Schumann et al 2011, Deuber et al 2013). Reducing the cruise altitude of the entire global fleet of aircraft by 6 000 ft can substantially reduce contrail formation (Fichter et al 2005); however this requires aircraft to fly at a suboptimal altitude, leading to an increase in fuel burn and CO_2 emissions. Assessing the viability of such a strategy requires calculating the trade-off between CO_2 emissions and contrails. Zou et al (2013) use a monetization approach, which involves making value judgements on the relative 'cost' of each climate impact. Deuber et al (2013) use climate metrics
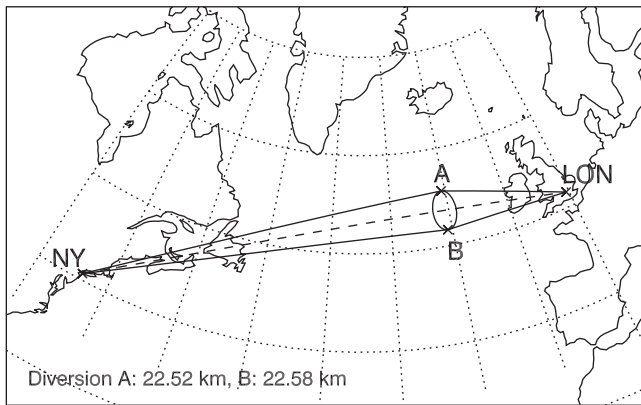
Figure 1. An illustration of typical distances added to a flight between New York (NY) and London (LON), in order to avoid an ISSR (ellipse) of radius 2 degrees. For flight in still air, the shortest route is the great-circle route (dashed line). The shortest alternative routes which avoid the ISSR (solid lines) are two great circle routes via point A or B.

which are based on the response of the atmosphere to the relative forcings, providing a framework which is useful in a policy context. For an individual flight, however, a framework is required which can be adapted to take into account the characteristics of the aircraft and the prevailing weather conditions since the altitude at which contrails are formed is highly dependent on the weather pattern (Irvine *et al* 2012).

Moreover, less attention has been paid to re-routing aircraft without altitude changes; such a strategy might be preferable where the increase in flight distance is small, since it allows an aircraft to remain at the altitude where it is most fuel-efficient. As motivation for this approach we provide an idealised example. Figure 1 shows a circular ISSR of radius 2 degrees, located along the great circle route between two airports. As shown on figure 1 the shortest alternative route avoiding the ISSR (in zero wind conditions) is to fly great circle routes from LON-A, and A-NY. This increases the flight distance by 22.5 km, 0.4% of the original route. We note also that since the increase in flight distance is dependent on how wide the ISSR is in the direction perpendicular to the original flight, it is independent of the contrail length. Together this implies that if regions in which contrails may be formed can be predicted, and routes recalculated to avoid them, then the added flight distance and therefore the CO_2 penalty may be small.

We assess the following situation: at the flight planning stage, an aircraft is predicted to encounter an ISSR along its proposed route. An alternative route is found, at the same altitude, which avoids the ISSR but increases the flight length. Which route is preferable? Considering only the climate impact of the contrails and CO_2 emissions (thus neglecting other non-CO_2 emissions that have a climate effect such as oxides of nitrogen, NO_x), the new route is preferable only if the climate impact of the CO_2 emissions from flying the additional distance are smaller than the climate impact of the avoided contrail.

Towards answering this question, this work provides a simple framework with which to assess the trade-off between the climate impact of aviation CO_2 emissions and contrails for a single flight. We show how this decision is impacted by uncertainties in the input parameters which result from the limitations of our current understanding of the climate impacts of aviation contrails. Here we assume that there has been a policy decision in favour of avoiding contrails where it would be climatically beneficial to do so, and show the results for a range of metrics and time horizons, to illustrate how different policy choices affect the decision of which route to take. This work provides a simple framework with which to interpret output from more complex calculations which simulate multiple flights in a realistic air-traffic framework (e.g. Sridar *et al* (2013)) with a larger range of aviation climate impacts (e.g. Grewe *et al* (2014)).

Section 2 provides details of the framework and the parameters used in the calculations. The framework is applied with representative figures for 'typical' contrails in section 3, and the sensitivity of the results to uncertainties in the input parameters is examined. Conclusions are presented in section 4.

2. The framework

It is only beneficial to fly extra distance dx to avoid making a contrail, if the climate impact of the extra distance flown is smaller than the climate impact of the avoided contrail. There is therefore a distance for which these climate impacts are equal (discussed in terms of a turning-point by Deuber *et al* (2013)); this implies that it is beneficial to avoid making the contrail only if dx is smaller than this threshold distance, d$x_{\max}$, which in the simple framework developed here is given by:

$$\mathrm{d}x_{\max} = \frac{L_{\mathrm{CON}} \times W_{\mathrm{CON}} \times M_{\mathrm{CON}}(H) \times E}{FF \times EI_{\mathrm{CO_2}} \times M_{\mathrm{CO_2}}(H)} \qquad (1)$$

where the numerator is the climate impact of making the contrail, defined in terms of the contrail length L_{CON} and width W_{CON}, and climate efficacy E. The denominator is the climate impact of the CO_2 emissions from flying the additional distance to avoid making the contrail, defined in terms of the fuel flow FF in kg fuel per km and the emission index of CO_2, $EI_{\mathrm{CO_2}}$, which is a constant (3.16 kg CO_2 (kg fuel)$^{-1}$ for kerosene fuel). The climate impact is measured by an emission metric M, applied with time horizon H. These parameters are discussed in turn in the following sections.

2.1. Contrail parameters

The contrail climate impact is related to the area covered by the contrail, expressed here as the product of its length and width. Here, we define L_{CON} to be the distance travelled by the aircraft through an ISSR; therefore it is determined by the size of the ISSR and the path the aircraft takes through this. Data from MOZAIC (Measurements of Ozone and Water Vapour by Airbus In-Service Aircraft) show a peak path length of

150 km through ISSRs (Gierens and Spichtinger 2000), although ISSR sizes range from the order of 10 km to 1000 km (Gierens and Spichtinger 2000, Irvine *et al* 2013, Iwabuchi *et al* 2012). The eventual contrail width is determined by the lifetime of the contrail and the magnitude of the vertical wind shear, which acts to increase the effective horizontal cross-section of the contrail. Neither the contrail width or lifetime (required for the calculation of the climate metrics) are simple to pre-determine. The range of observed and modelled linear contrail widths is 1–10 km, generally with a peak at smaller values (Freudenthaler 1995, Duda *et al* 2004, Burkhardt and Kärcher 2009, Iwabuchi *et al* 2012). Contrail-cirrus lifetimes of up to 24 h have been observed (e.g. Haywood *et al* (2009)) but contrail lifetimes are generally not well-constrained by observations, particularly since long-lived contrails become difficult to track once they evolve into contrail-cirrus. Modelling of individual contrails suggests a modal lifetime of 1 h (Schumann 2012), and a typical duration of less than 6 h (Irvine *et al* 2014) based on air-parcel trajectories. We assume a contrail lifetime of 5 h in the climate metric calculations, following Fuglestvedt *et al* (2010). This lifetime has previously been used as an upper-bound for the lifetime of young contrails (Newinger and Burkhardt 2012). Measurements of a small number of short-lived contrails indicate that larger heavier aircraft may produce wider and thicker contrails than smaller lighter aircraft (Jeßberger *et al* 2013); given the lack of similar data for persistent contrails in ISSRs we assume contrail properties to be independent of aircraft type.

2.2. CO$_2$ parameters

The amount of additional CO$_2$ emissions is the product of the distance, the fuel flow and EI_{CO_2}. *FF* varies depending on the aircraft type. Representative values of *FF* for different classes of aircraft (referred to as small, medium, large and very large jets) were calculated using the FAST model (Lee *et al* 2005), assuming for each aircraft type a loading of 70% and typical design weights and cruise altitudes. Values range from about 3 g m^{-1} to 11 g m^{-1}. Increasing the flight distance requires the aircraft to carry additional fuel, which increases the weight of the aircraft and thus also increases the fuel burn. In this study we neglect this second order effect.

Previous work (Sridar *et al* 2013, Zou *et al* 2013) indicates that in a realistic air-traffic scenario, the most effective way of reducing contrail formation for small increase in fuel burn is through a combination of horizontal re-routing with altitude changes. The framework presented here could be expanded to include altitude changes by incorporating a fuel penalty to account for the increase in fuel burn from flying at a sub-optimal altitude; this was beyond the scope of the present study.

2.3. Climate metric parameters

There is no uniquely suitable choice of metric to measure the climate impact of the contrail and CO$_2$ emissions. Here we use both the the absolute global warming potential (AGWP)
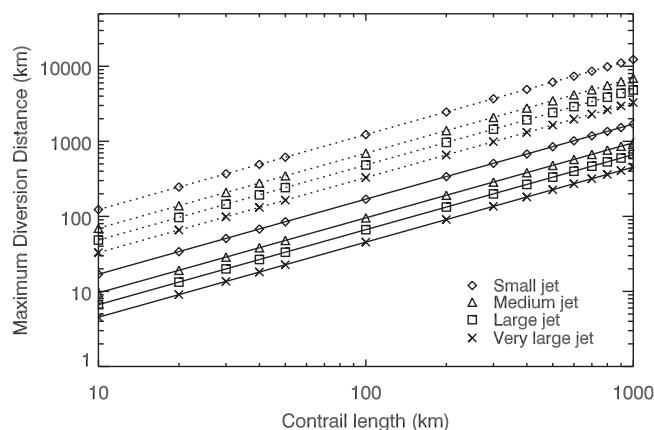

Figure 2. dx_{max} as a function of contrail length for AGWP (dotted line) and AGTP (solid line) metrics for a time horizon of 100 years. The calculations use a contrail width of 1 km.

and absolute global temperature potential (AGTP) for pulse emissions (since we consider a single flight), calculated with a time horizon *H* of 20, 50 or 100 years. The AGWP and AGTP are both frequently-presented metrics (Myhre *et al* 2013), but the choice of which one is most appropriate (and which time horizon is most appropriate) depends on the context and on the aims of any climate mitigation policy. The GWP (e.g. Myhre *et al* (2013)) with a 100 year time horizon is used for deriving CO$_2$-equivalent emissions for a set of greenhouse gases under the Kyoto Protocol to the United Nations Framework Convention on Climate Change. The GTP (e.g. Shine *et al* (2007)) may be a more appropriate metric for a policy based on meeting specified temperature targets. The AGWP is the time-integrated radiative forcing following a pulse of either contrail formation or CO$_2$ emission. For the long time horizons used here, the AGWP of the contrails is independent of the choice of time horizon, as the contrail will have totally disappeared by the time horizon. Note that the AGWP of a contrail is closely related to the concept of 'energy forcing' due to contrails introduced by Schumann *et al* (2012) and differs only in the choice of unit (see supplementary information). By contrast, the AGTP measures the temperature change at some future time after the pulse: the memory associated with the thermal inertia of the oceans means that the contrail AGTP does vary with time horizon. For both the AGWP and AGTP, the CO$_2$ impulse-response function, that determines the longevity of the CO$_2$ perturbation following the pulse emission, is taken from Joos *et al* (2013). Additionally, the AGTP requires the specification of an impulse-response function, representing the temperature response to the pulse emission—this introduces an added uncertainty, as this depends on the climate sensitivity and the uptake of heat by the ocean. We use the widely-adopted formulation of Boucher and Reddy (2008) (e.g. in Myhre *et al* (2013)), for these illustrative purposes. The values of *M* used in the baseline calculations are shown in table 1 .

For the contrail climate impact we also take into account *E. E* measures the equilibrium surface temperature response, per unit radiative forcing, relative to that of CO$_2$ (Ponater

Table 1. Specific forcing, AGTP and AGWP values for CO_2 and contrails, for three different time horizons. For CO_2 X is $kg(CO_2)$, for contrails X is km^2.

Emission	Specific forcing W m^{-2} X^{-1}	AGTP K X^{-1}			AGWP W m^{-2} yr X^{-1}		
		20 yr	50 yr	100 yr	20 yr	50 yr	100 yr
CO_2	1.77e-15[a]	6.6e-16	5.6e-16	4.9e-16	2.5e-14	5.4e-14	9.3e-14
contrails	1.96e-8	8.9e-14	1.3e-14	9.2e-15	1.1e-11	1.1e-11	1.1e-11

[a] Joos *et al* (2013)

et al 2005). There are only two published estimates of *E* for contrails: 0.6 (Ponater *et al* 2005) and 0.31 (Rap *et al* 2010). Given the lack of consensus, for our baseline calculations we take *E* to be 1.0, and calculate the sensitivity of our results to these smaller values of *E*.

Contrail radiative forcing will vary according to, for example, the time of day, the natural cloud cover, contrail thickness (which may itself have a dependence on aircraft type) and the underlying surface. In an operational setting, this would need to be accounted for by calculating the contrail radiative forcing using a forecast model. However, estimates of contrail radiative forcings will vary by model, as was shown by Myhre *et al* (2009). For our baseline calculations we use a contrail specific radiative forcing estimated from the Myhre *et al* (2009) radiative forcing intercomparison study, where a global homogeneous contrail cover of 1% with an optical depth of 0.3 produced an annual mean all sky net radiative forcing of about 0.1 W m^{-2}, but we examine the sensitivity to this value in section 3.

3. Results

We investigate the results given by this simple framework for a range of aircraft types, using for these baseline calculations contrail parameters W_{CON} = 1 km, E = 1.0 and a contrail lifetime of 5 h. Figure 2 shows dx_{max} calculated using these parameters for AGWP and AGTP metrics with H of 100 years. Since the total diversion distance dx is independent of contrail length, we calculate dx_{max} for contrail lengths between 10 km and 1000 km. To put the distances shown in figure 2 into context, the great circle distance between London and New York is 5541 km, and London and Singapore is 10 900 km. For a given aircraft type and metric, dx_{max} increases linearly with contrail length. Note that an alternative expression of the results is therefore as a factor of contrail length, i.e. using the 100 yr AGWP for a large jet, dx_{max} is 4.8 times the contrail length. dx_{max} shows some dependence on aircraft type, but the largest dependence is on the choice of metric.

The dependence of dx_{max} on metric and time horizon is shown in table 2 for the case where L_{CON} = 100 km (results are shown rounded to the nearest 10 km). There is a large decrease in dx_{max} by increasing the time horizon from 20 to 50 years for the AGTP, but little difference between H of 50 and 100 years since the contrail is short-lived. The time

Table 2. dx_{max}, for a contrail of length 100 km and width 1 km, for different aircraft classes as a function of climate metric and time horizon H.

Aircraft class	H (yr)		
	20	50	100
	dx_{max} (km) for AGTP		
Small jet	1310	210	170
Medium jet	740	120	100
Large jet	510	80	70
Very large jet	350	50	50
	dx_{max} (km) for AGWP		
Small jet	4530	2130	1230
Medium jet	2550	1200	690
Large jet	1780	840	480
Very large jet	1210	570	330

dependence of the AGWP metric is solely due to the decay of the pulse of CO_2 since the contrail AGWP is constant with time. To put these results into perspective, for the example in figure 1, if the contrail length was 100 km and dx was 22.5 km, then based on the results in table 1, dx_{max} is always greater than dx so it is climatically beneficial to fly the alternative route and avoid the contrail. Table 1 shows that for both metrics typically dx_{max} is four times larger for a small jet than for a very large jet (assuming the contrail properties are independent of aircraft type), indicating that longer diversions are possible for these smaller aircraft. The AGWP values are three to ten times greater than the AGTP, depending on time horizon, because the AGWP gives more weight to the shorter-lived forcing, while the AGTP has less memory of the short-lived forcing and thus gives more weight to the longer-lived CO_2 forcing. This shows that the use of the AGWP means that it is perceived that longer diversions are possible than when using the AGTP.

The impact of some of the uncertainties in our understanding of the contrail climate impact on the calculation of dx_{max} are shown in table 3, for a large jet forming a 100 km contrail with the climate impact assessed using the AGWP with H of 20 years and 100 years. First, using the same contrail specific RF, we assess the sensitivity to the choice of *E*. Since dx_{max} scales linearly with *E*, the uncertainties in *E* lead to a factor of 3 difference between the highest and lowest *E*. To give a conservative estimate of the range of dx_{max} given

Table 3. The sensitivity of dx_{max} to uncertainties in the contrail climate impact. Calculations are for a large jet forming a contrail of length 100 km and width 1 km, with the AGWP metric and H of 20 and 100 years.

Calculation	Efficacy	Contrail SRF W m^{-2} km^{-2}	dx_{max} (km) for H	
			20 yr	100 yr
Baseline	1.0	1.96e-8	1780	480
Medium_*E*	0.6[a]	1.96e-8	1070	290
Low_*E*	0.31[b]	1.96e-8	550	150
high_*E*_SRF	1.0	3.92e-8[c]	3550	970
low_*E*_SRF	0.31	6.09e-9[d]	170	50

[a] Ponater *et al* (2005).
[b] Rap *et al* (2010).
[c] Calculated from net RF 0.2 W m^{-2}, Myhre *et al* (2009).
[d] Calculated from net RF 5.9 mW m^{-2}, Froemming *et al* (2011).

possible values of E and contrail specific RF, high_E_SRF takes the high estimates of E and contrail specific RF and low_E_SRF takes low values. Note that the uncertainties in E and contrail specific RF are indicative of our current level of understanding and as such are not intended to give an upper and lower bound on dx_{max}. This gives a factor of 20 difference between the high and low estimates, changing dx_{max} from 3550 km to 170 km for H of 20 years.

It is possible that in single events contrails or contrail cirrus may have a much larger radiative forcing than considered here. Haywood *et al* (2009) estimate the contrail specific forcing for a single observed contrail-cirrus event which is 1000 times larger than the values considered in table 3. This estimate, used to calculate dx_{max}, gives dx_{max} on the order of 1×10^6 km with H of 20 years, implying that aircraft should always divert to avoid contrails. Such extreme large values of contrail radiative forcing clearly increase the uncertainty on the value of dx_{max}, but do not change the general conclusion that there is often a climate benefit to avoiding contrail formation.

Thus far, the framework has assumed flight in still air (the fuel burn model and thus the calculation of FF assumes flight in still air). For flights which are predominantly east-west oriented, such as trans-Pacific or trans-Atlantic routes, the location of the jet stream strongly influences the route location (Irvine *et al* 2013). Re-routing the aircraft may route the aircraft into less favourable winds so that a smaller flight distance is achieved for the same fuel burn. We can incorporate the effect of a reduced tailwind into equation (1) via an additional parameter which increases FF by a factor $1 + \Delta v/v$, where v is the true airspeed of the aircraft and Δv is the change in speed induced by the effective tailwind. As a realistic upper bound on Δv we calculate the horizontal wind shear in the region of the midlatitude jet stream, where we would expect to find the strongest horizontal gradients in wind speed at aircraft cruise altitudes. Based on the climatological latitudinal jet stream profile in the north Atlantic, calculated from 1989–2010 ERA-Interim data (Dee

et al 2011), an aircraft flying eastbound with a diversion of 2 degrees from the jet core results in a reduced tailwind by 10 m s^{-1}. Using $v = 250$ m s^{-1}, typical of a very large aircraft, decreases dx_{max} from 1210 km to 1160 km (for AGWP20, 100 km contrail), and from 330 km to 320 km (for AGWP100, 100 km contrail) when the effective headwind is added. Thus the effect of wind is much smaller than the effect of uncertainties in the calculation of the contrail climate impact.

4. Conclusions

We have developed a simple framework to enable the trade-off between contrail and CO_2 climate impacts to be estimated for a single flight. The framework currently considers re-routing without altitude changes, which has the advantage of allowing the aircraft to fly at its most fuel-efficient altitude. The trade-off calculation depends on aircraft parameters such as fuel flow rate which are known *a priori*, and meteorological parameters such as the contrail size, lifetime and radiative forcing, which would be required to be known *a priori* were such a strategy to be implemented operationally.

The framework calculates the maximum extra distance that can be added to a flight, before the additional CO_2 emissions outweigh the benefit of not contrailing. As the quantity of CO_2 emissions depends on aircraft type, any decision to avoid making the contrail would be highly dependent on aircraft type. For example, using the AGWP metric with 100 year time horizon, the extra distance that a small jet can fly is more than ten times the avoided contrail length, whilst for a very large jet this reduces to three times. As discussed by Deuber *et al* (2013), it is important to choose a suitable metric, depending on the required outcome. Here, we find a factor of 3–10 difference between the AGTP and AGWP results, depending on the time horizon used.

This framework is useful to show where the major uncertainties are. Joos *et al* (2013) find that calculations of the atmospheric CO_2 response agree within 15%, thus the climate impact of the flight's CO_2 emissions can be calculated with a relatively small uncertainty, given knowledge of aircraft fuel burn. The calculation of the climate impact of the contrail has a much larger uncertainty. The uncertainty chiefly arises from two sources: an inability to estimate, *a priori*, the eventual size and therefore climate impact of the contrail that would be formed, and second the radiative forcing (which has a potential dependence on the time of day, not taken into account here) and climate efficacy of that forcing. Even if the radiative forcing were calculated operationally within a forecast model, there would still be an uncertainty in the size of the calculated radiative forcing due to the radiative forcing codes (Myhre *et al* 2009), and also due to uncertainty in the contrail characteristics. Taking into account the uncertainty in the eventual climate impact of a contrail of 100 km length, the estimate of the maximum diversion distance varies by a factor of 20.

The application of such a strategy in the real world would require highly accurate forecasts of ISSRs where potential contrails form, and the ability to know *a priori* the climate impact of a potential contrail, as well as being highly dependent on air traffic control and other operational and economic considerations. In addition, the overall climate impact of the flight should take into account the chemical forcings from aircraft NO_x emissions; detailed calculations of such 'climate optimal' routings are currently being performed by the REACT4C project. We note here that for small horizontal diversions it is possible that the chemical forcings between the two routes would be comparable; however since the impact depends on where the NO_x emissions are advected, small diversions could potentially result in large differences in impact (Grewe *et al* 2014). The impact of black carbon and other aerosol emissions may also be important and could be incorporated in more detailed estimates (Jacobson *et al* 2012).

Nevertheless, despite the uncertainties, the calculations presented here indicate that once a metric (and time horizon) choice has been made, guidance can be given as to whether it is beneficial to divert to avoid contrails. So for example, adding 100 km distance to a flight to avoid making a contrail would seem beneficial for many of the cases presented here, and other parameter choices, such as the extreme high values in Haywood *et al* (2009), could allow significantly longer diversions.

Acknowledgments

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