

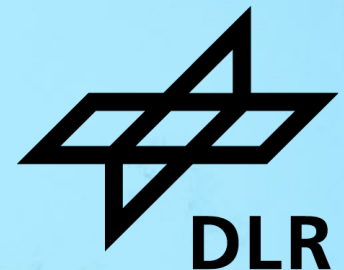
# POTENTIAL AND LIMITATIONS OF SATELLITE REMOTE SENSING FOR CONTRAIL AVOIDANCE

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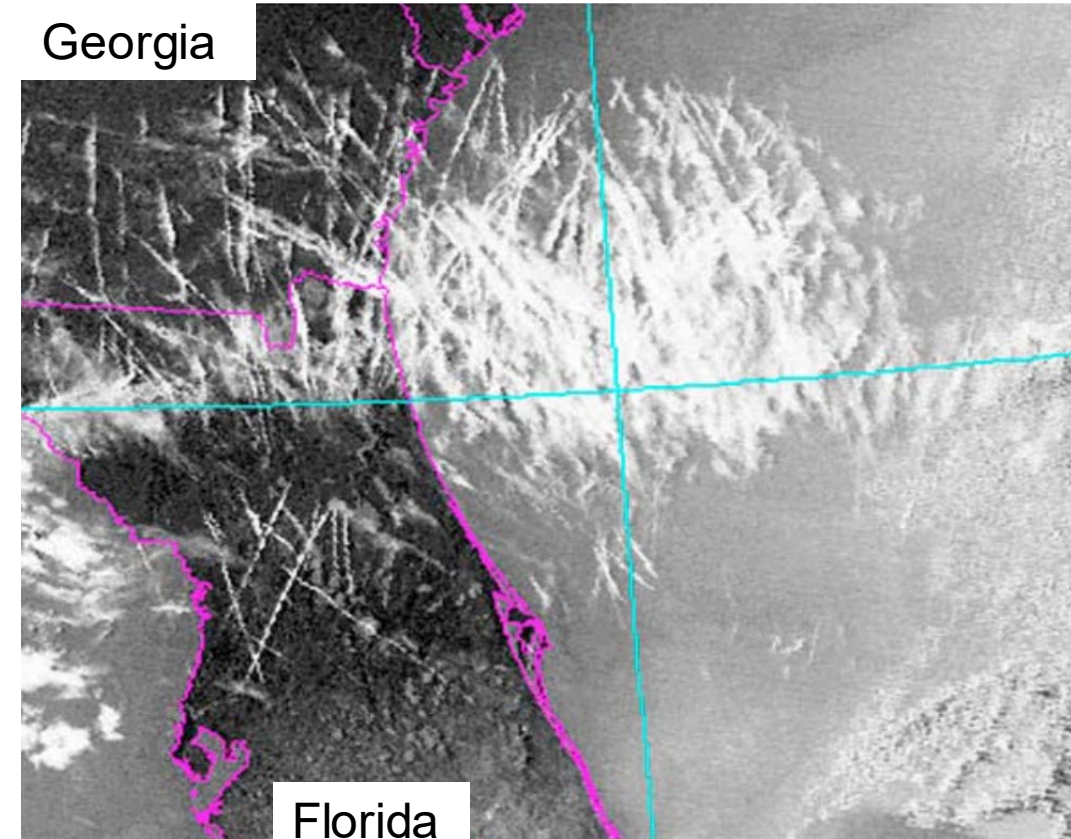
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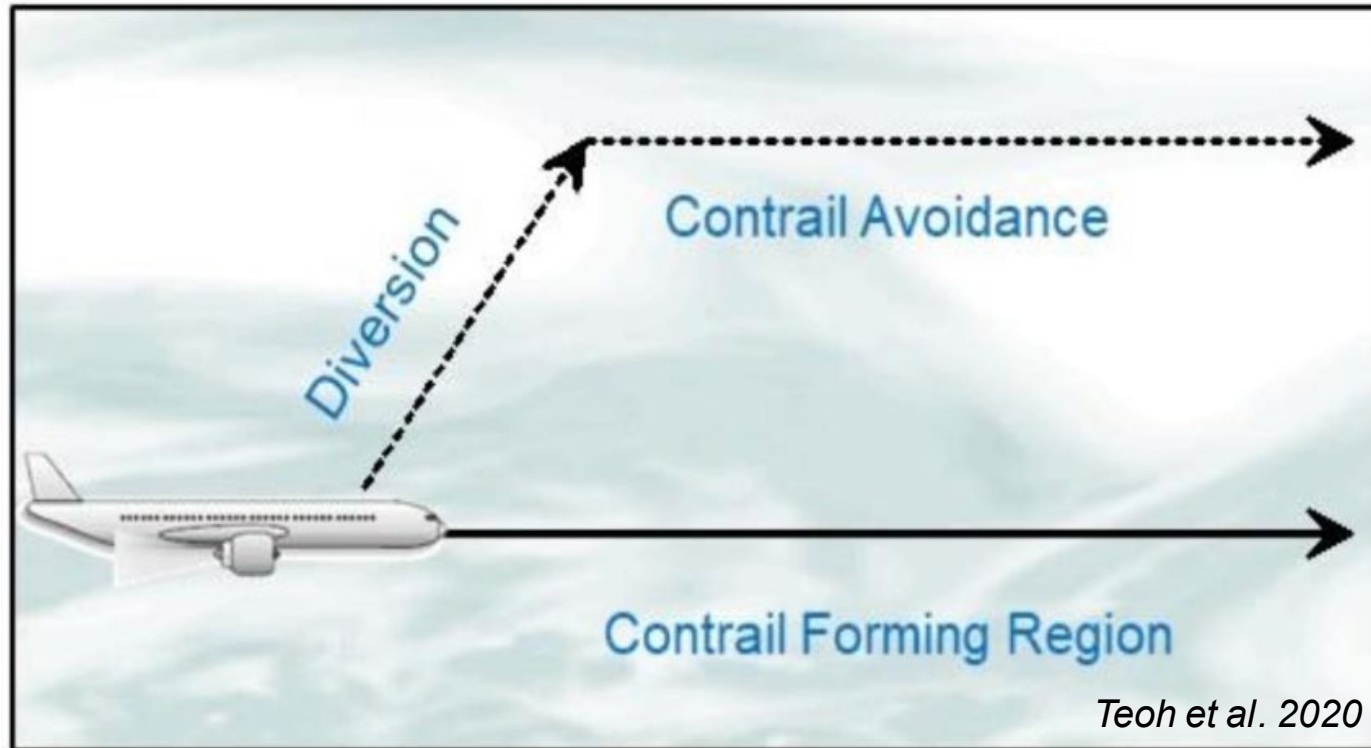
# Persistent contrails

- **Persistent** contrails that form in ice supersaturated conditions spread in the atmosphere, can live for hours and evolve into **contrail cirrus**.
- Contrail cirrus is responsible for more than 50% of the aviation climate impact in terms of effective radiative forcing ERF (Lee et al. 2021).
- Contrail **outbreaks** are responsible for the majority of the contrail cirrus ERF (Burkhardt et al. 2018).
- Small vertical or lateral diversions can allow to **avoid** the formation of persistent contrails.
- Already the re-routing of a small number of flight can significantly reduce the climate impact of contrails (Teoh et al. 2020, 2022).



*Minnis et al. 2013*

# Contrail avoidance



Requires:

- realistic **weather** predictions (humidity, clouds)
- realistic **contrail** prediction models
- adaption of flight **planning** and **ATC** procedures
- **evaluation** of contrail avoidance success

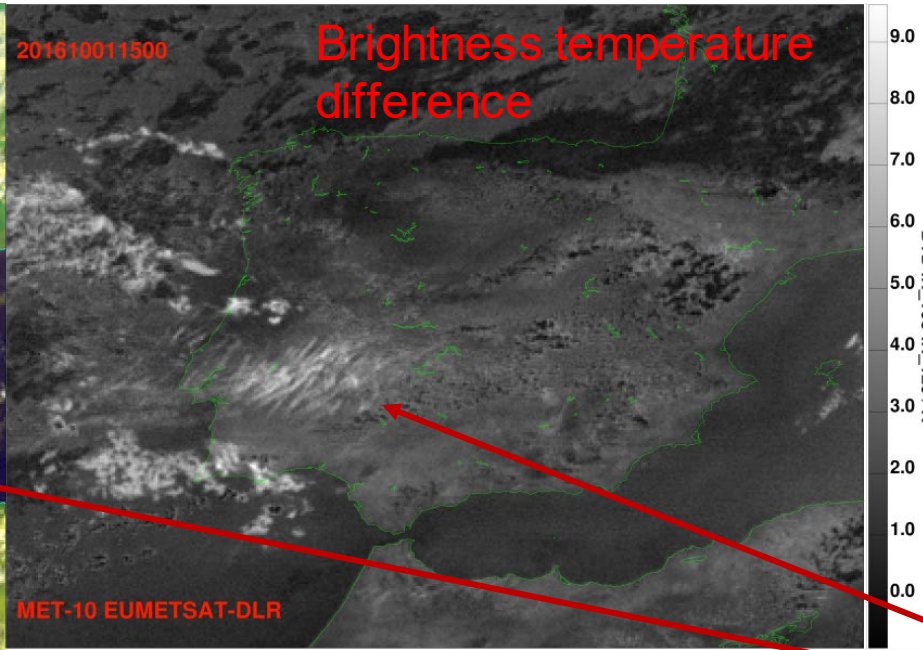
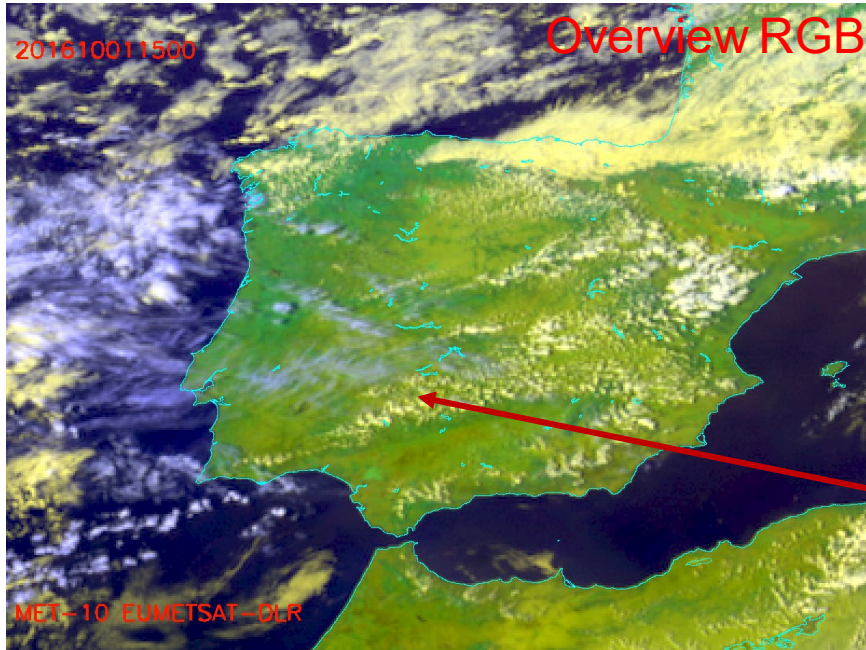
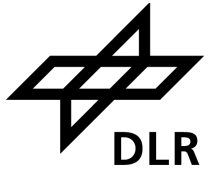


Observations are needed for model evaluation and contrail detection.

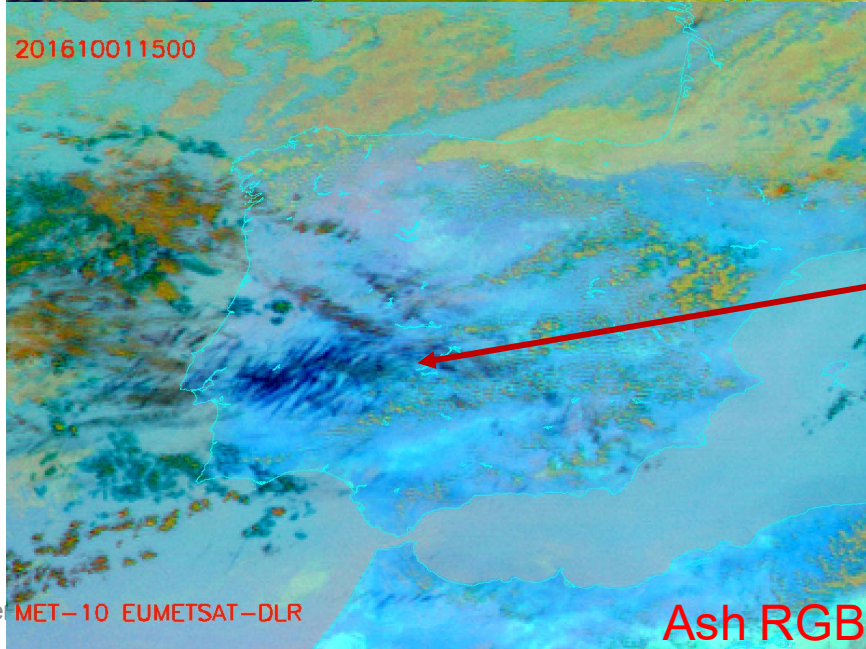
Passive remote sensing can provide an important contribution.

See e.g. LuFo D-KULT

# Passive remote sensing of clouds and radiation



Meteosat Second Generation  
MSG



contrails

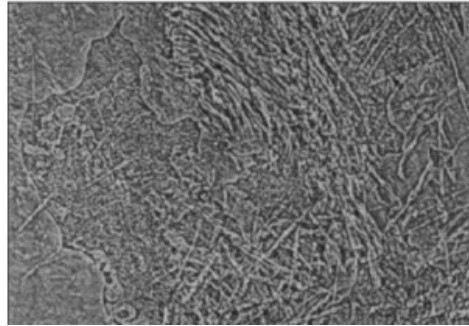
## Passive remote sensing

- Observations of reflected **solar** and emitted **thermal** radiation in various spectral channels
- **Geostationary**: **moderate** spatial and **high** temporal resolution
- **Polar orbiting**: **high** spatial and **low** temporal resolution
- Contrails, cloud properties, top-of-atmosphere outgoing radiation

# Contrail detection

## Image processing

- Convolutions and gradient detection to highlight linear structures



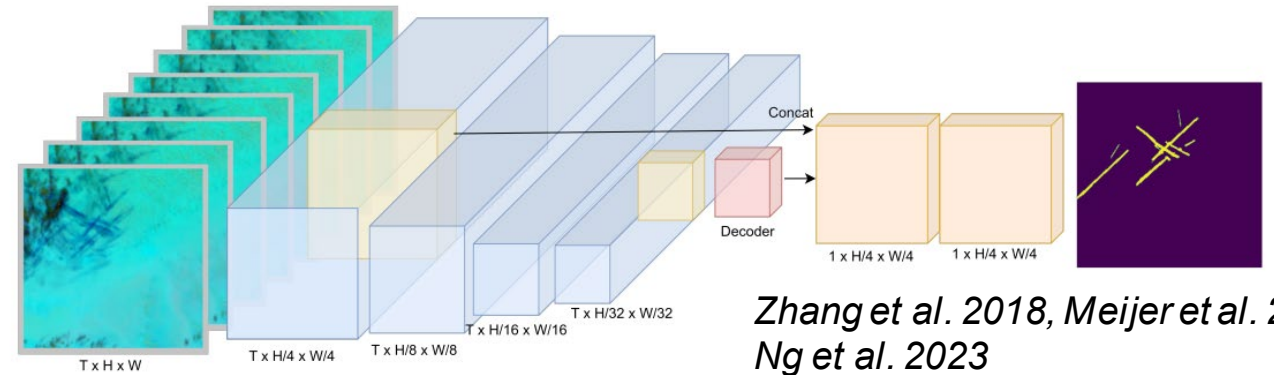
*Mannstein et al.  
1999: CDA  
Contrail  
Detection  
Algorithm*

- Main advantages: can be easily transferred to new sensors, easy to extend (e.g. spectral information)

Both methods are based on convolutions and both methods depend on **visibility** of contrails in thermal observations.

## Machine learning

- Convolutional neural networks to identify contrails



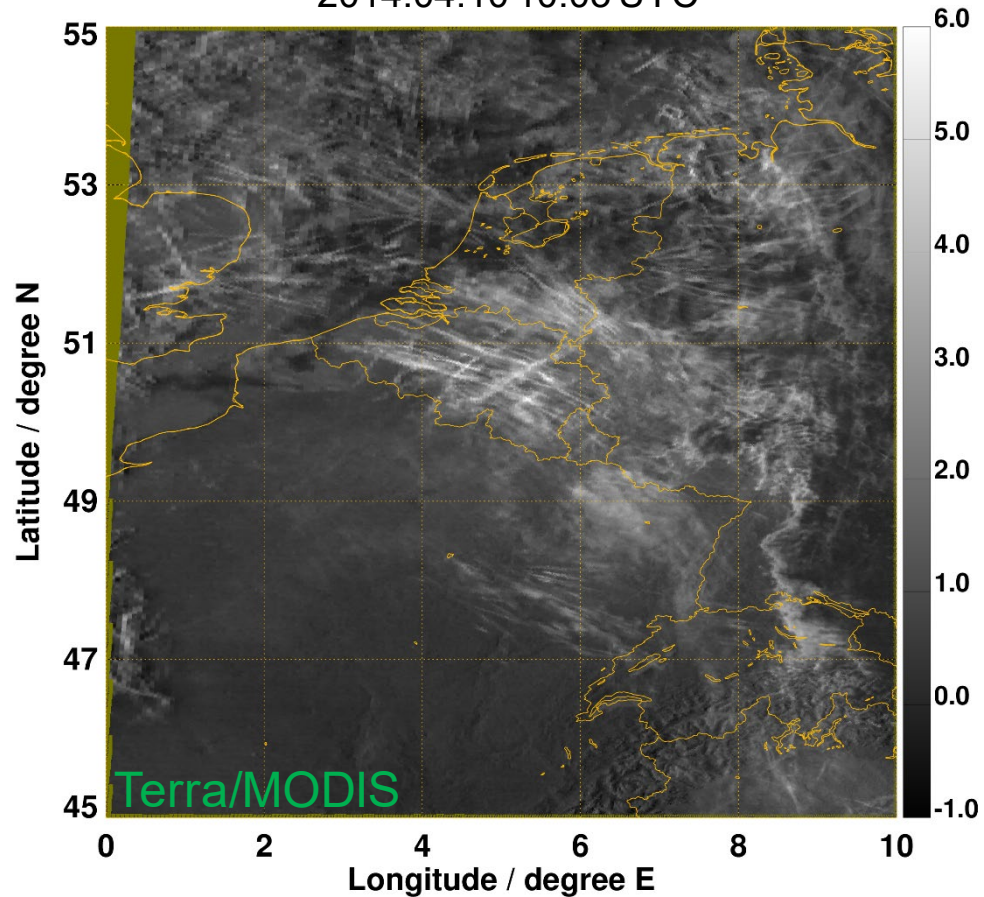
- Higher detection efficiency and less false alarms
- Main advantages: no need for manual thresholds, learns contrails, can exploit temporal evolution

# Contrail visibility is affected by spatial resolution

Polar orbiting satellites  
High: 1 km at nadir

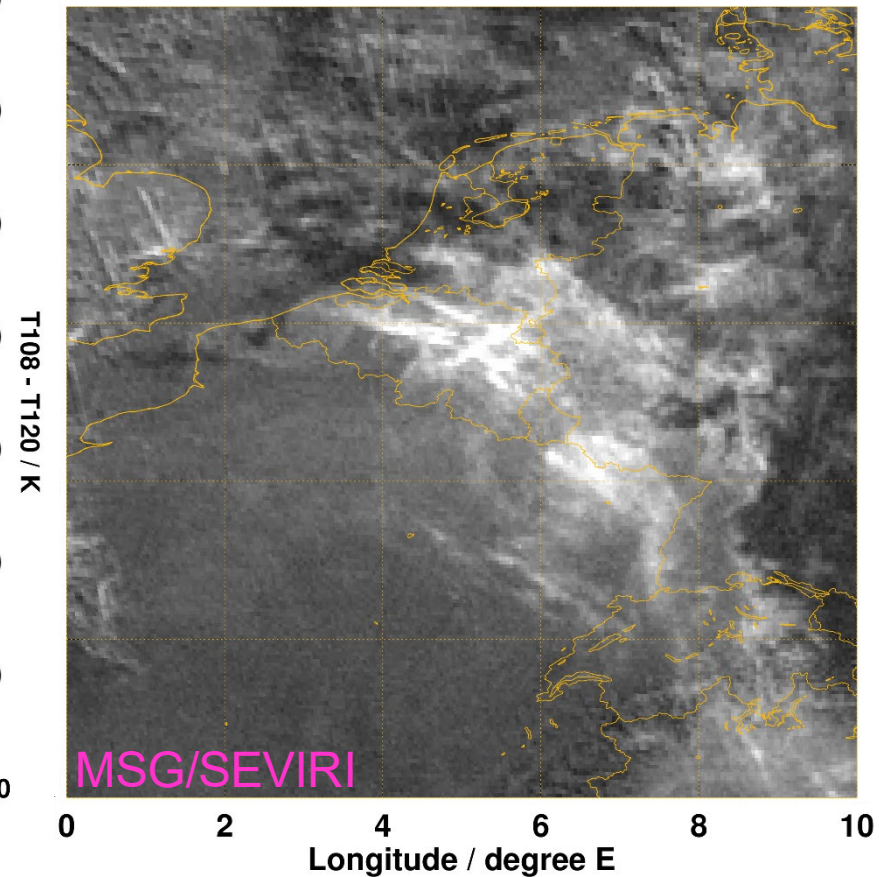
2014.04.10 10:03 UTC

spatial resolution



Geostationary satellites  
Moderate: 3x3 km<sup>2</sup> at SSP

2014.04.10 10:00 UTC



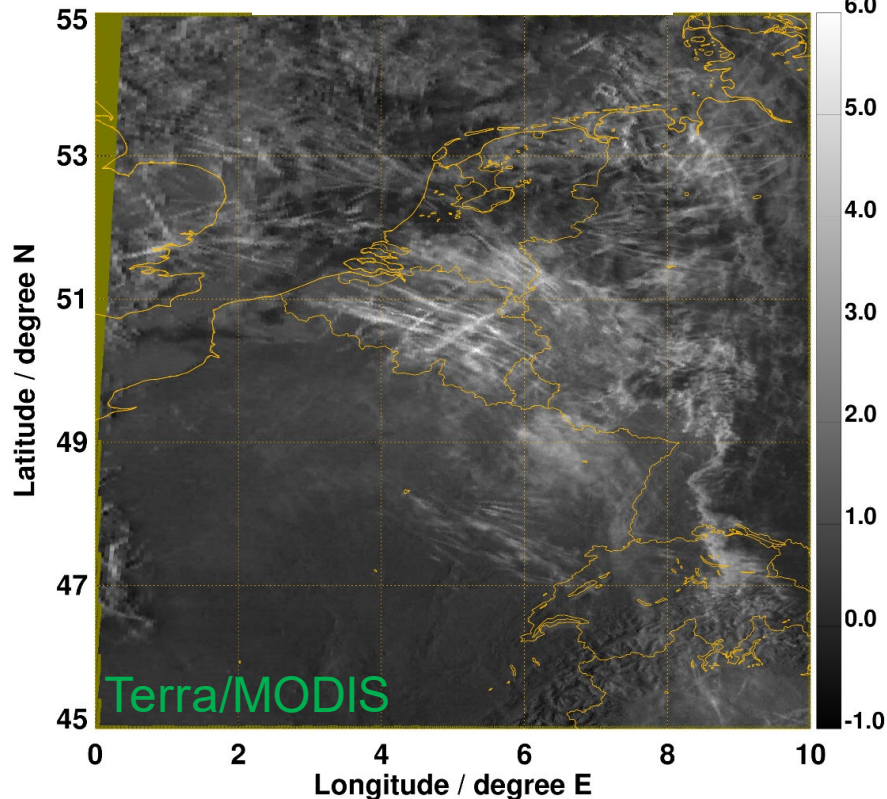
- Single **MSG/SEVIRI** contrails can consist of more than one contrail.
- Thin/young contrails cannot be seen in **MSG/SEVIRI**.
- Spreading and/or overlapping contrails can lose their linear shape.

# Contrail visibility is affected by spatial resolution

Polar orbiting satellites

High: 1 km at nadir

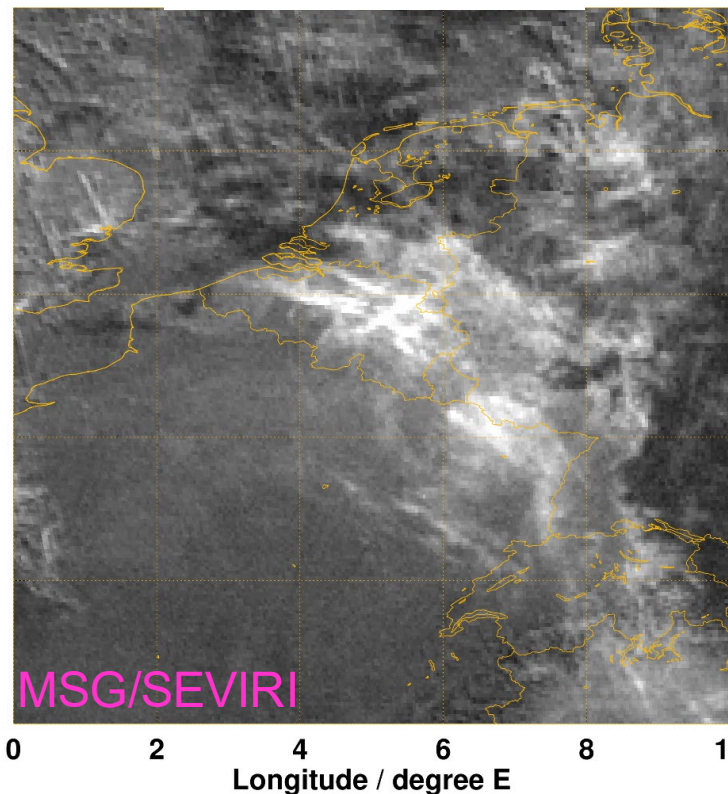
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Geostationary satellites

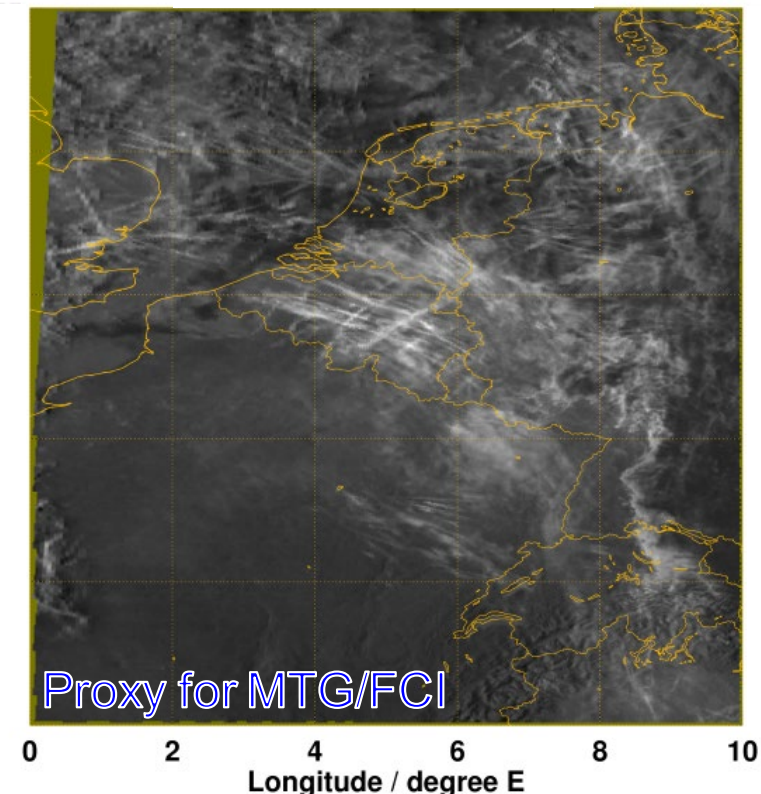
Moderate: 3x3 km<sup>2</sup> at SSP

2014.04.10 10:00 UTC



Good: ~2x2 km<sup>2</sup> at SSP

2014.04.10 10:03 UTC



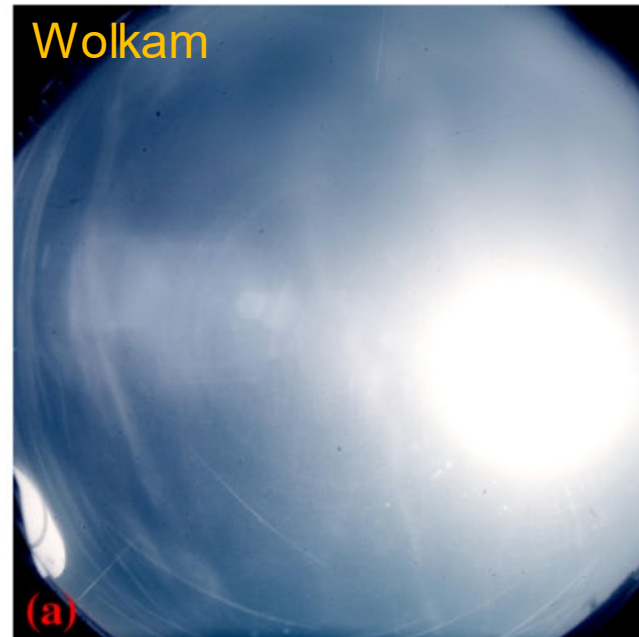
Mean over 2x2 MODIS pixels

- Current geostationary satellites (GOES, Himawari, MTG) can resolve more (persistent) contrails and earlier than the previous satellite generation.
- Overlapping contrails or contrails very close to each are challenging.

# Contrail visibility depends on pixel optical thickness



Mannstein, Brömser, Bugliaro 2010:  
Evaluation of contrail detection algorithm CDA with a whole-sky camera called Wolkam



Whole-sky camera located at DLR close to Munich

Polar orbiting NOAA/AVHRR

Visual inspection

Geostationary MSG/SEVIRI

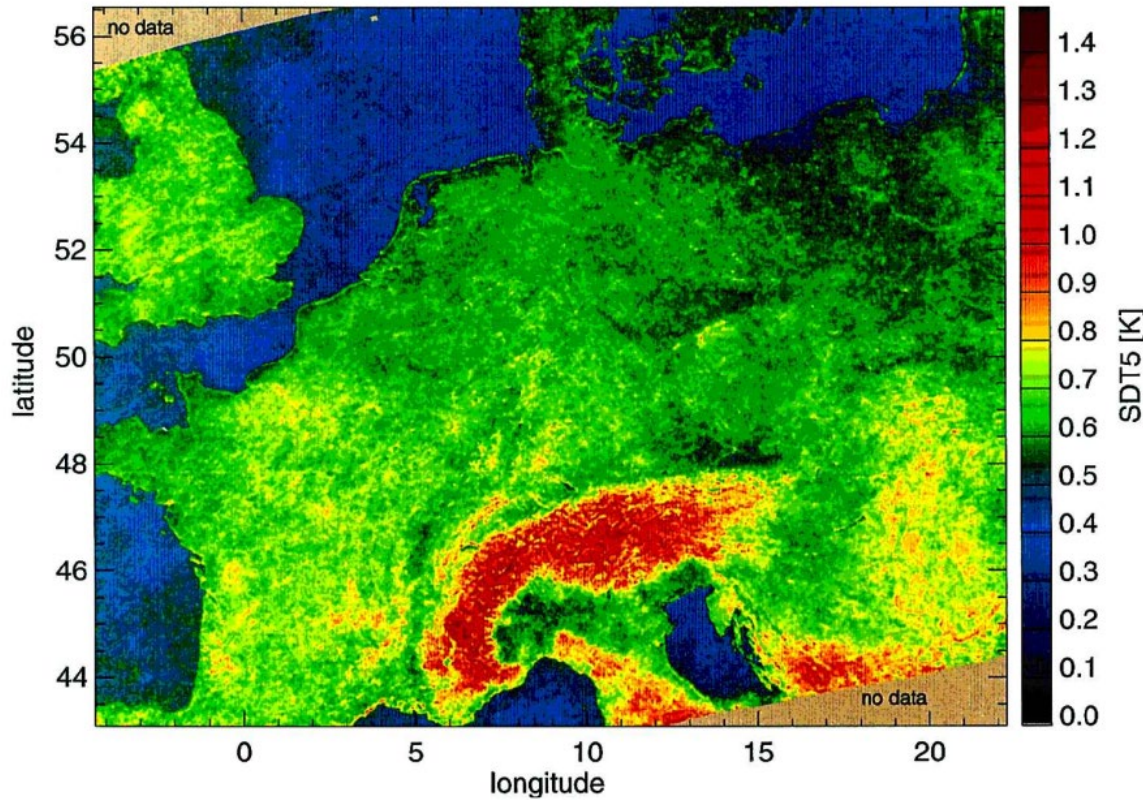
Visual inspection

Width/km	<0.5	0.5–0.9	1.0–1.9	2.0–4.9	≥5.0	total
Wolkam	21	21	33	14	7	96
Temp. difference	1	9	20	9	1	40
Colour composite	0	3	12	7	1	23
CDA	0	0	5	3	0	8

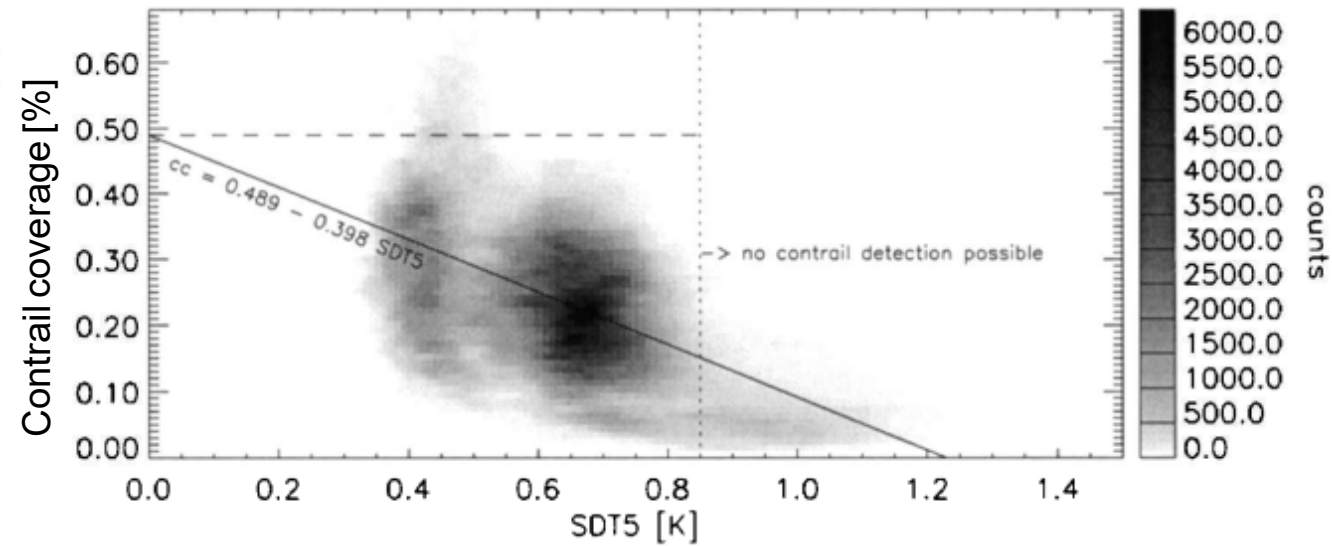
Width (km)	<0.5	0.5–0.9	1.0–1.9	2.0–4.9	≥5.0	total
Wolkam	29	27	14	7	2	79
Temp. difference	0	2	6	4	0	12
Colour composite	0	0	1	4	2	7
CDA	0	1	2	2	2	7

- Many narrow contrails are missed, some narrow contrails are detected, not all wide contrails can be detected
- Contrail visibility depends on pixel optical thickness
- Even visual detection of contrails in satellite data can miss contrails

# Contrail visibility depends on the contrast against the background



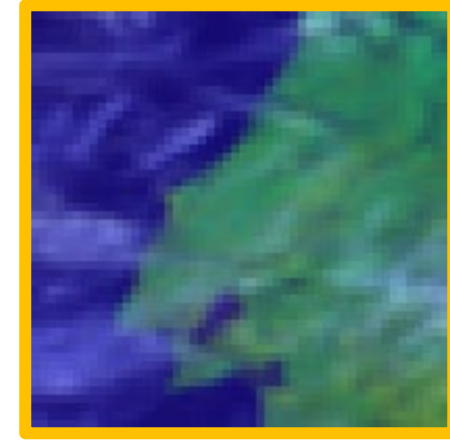
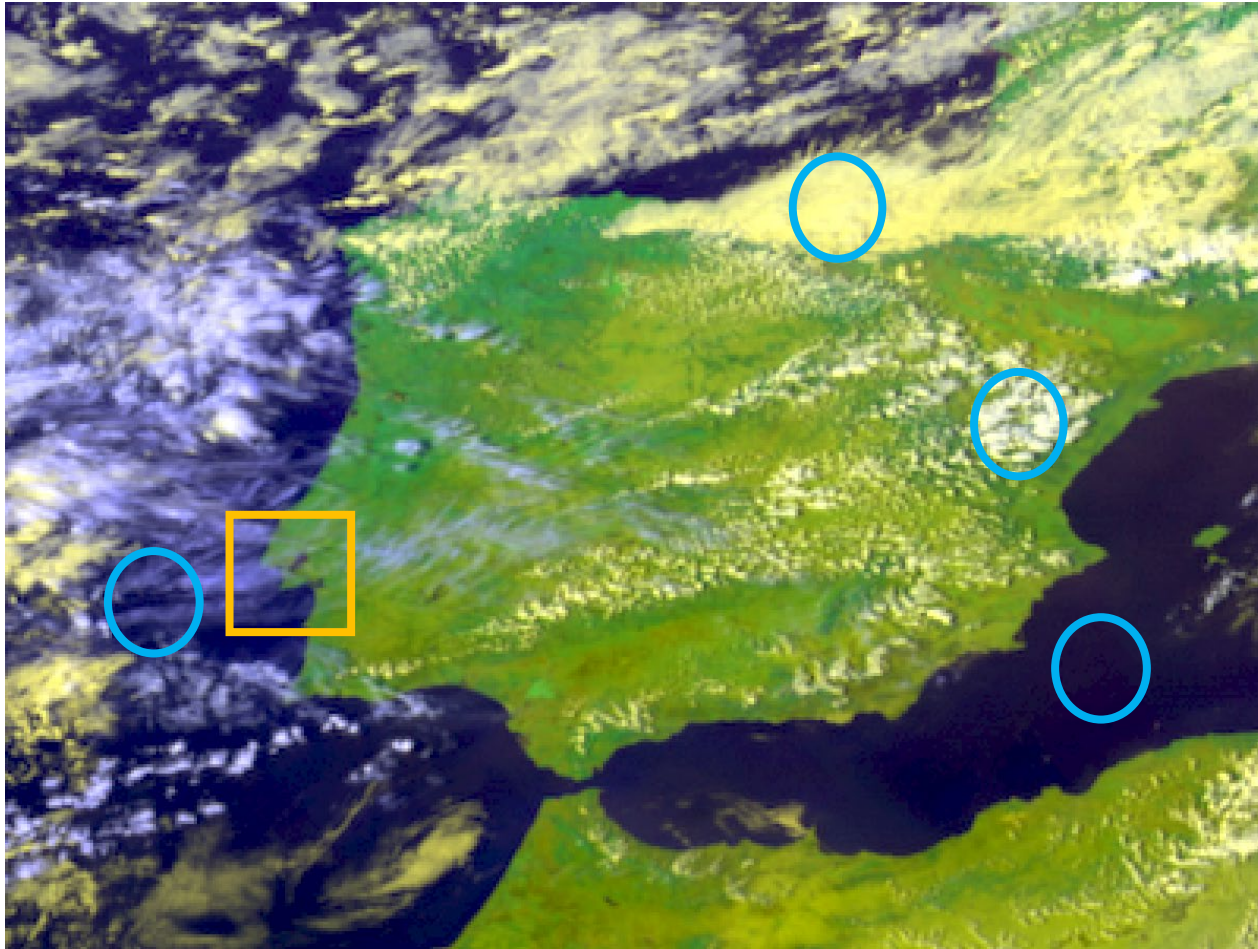
SDT5 = standard deviation of brightness temperature at 11  $\mu\text{m}$  in a 5x5 pixel surroundings



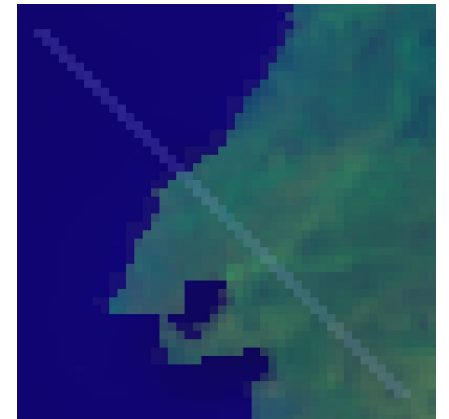
*Mannstein et al. 1999*

- Background inhomogeneity reduces contrail detection.

# Contrail visibility is affected by cloudiness

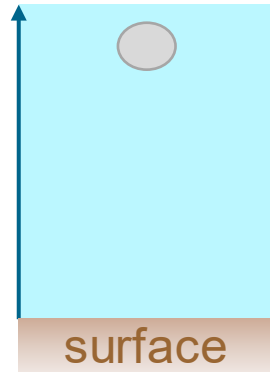


Radiative transfer simulations for a thin contrail in **different cloud situations** on 01.10.2016 15 UTC:



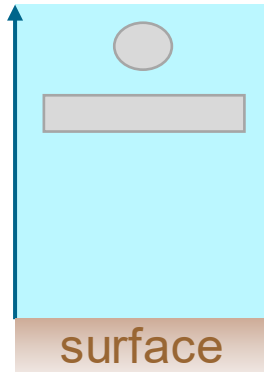
# Contrail

$\tau \approx 0.3$



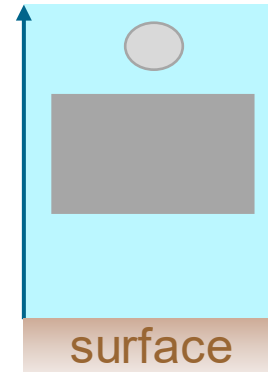
# Contrail + thin cirrus

$\tau \approx 0.2$



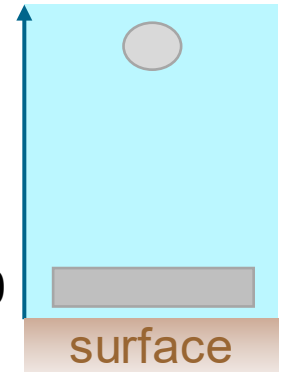
# Contrail + thick cloud

$\tau \approx 20$

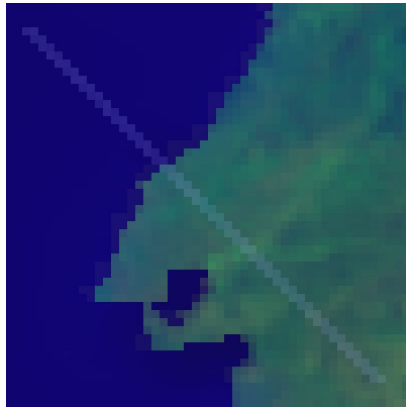


# Contrail + low cloud

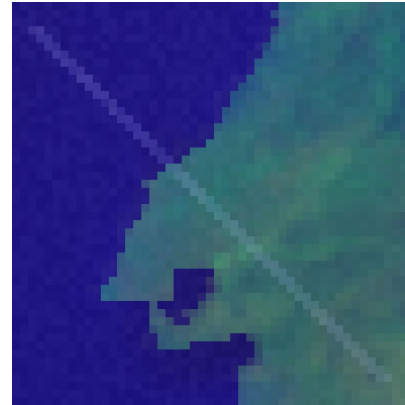
$\tau \approx 10$



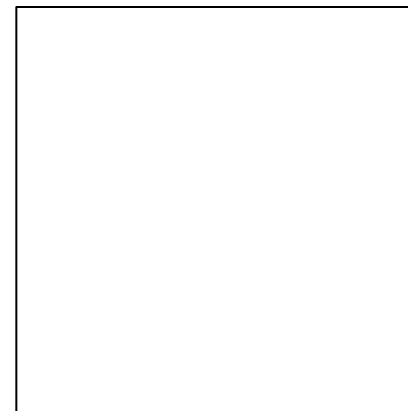
RGB



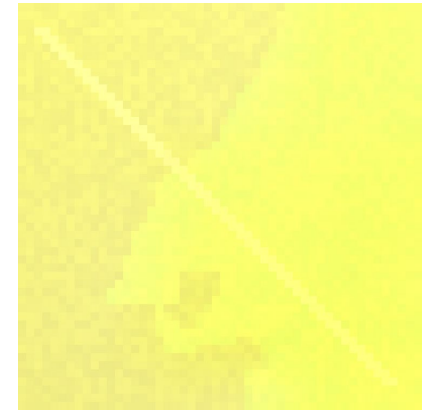
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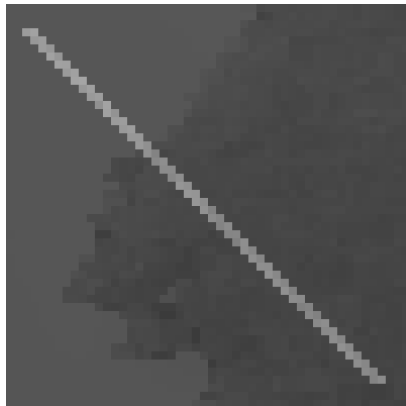
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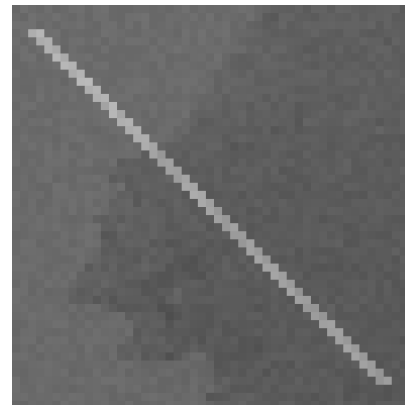
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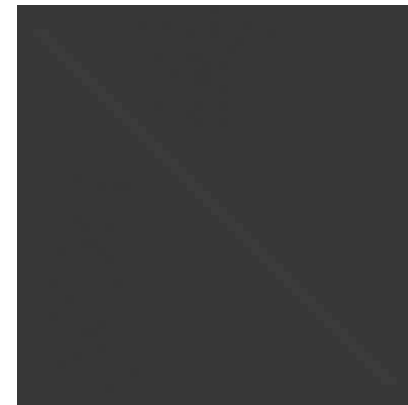
BTD



BTD



BTD

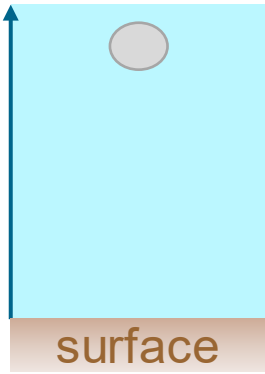


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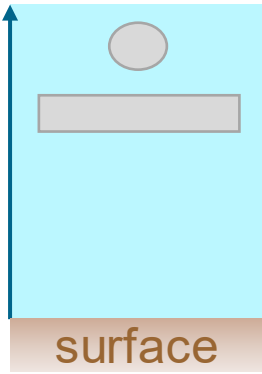
# Contrail

$\tau \approx 0.3$



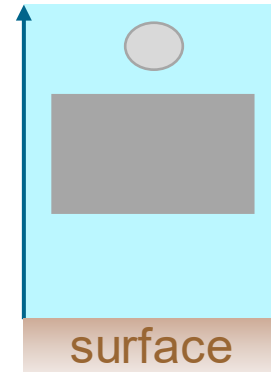
# Contrail + thin cirrus

$\tau \approx 0.2$



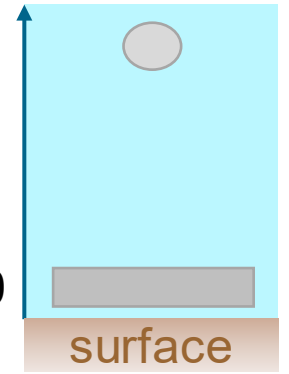
# Contrail + thick cloud

$\tau \approx 20$

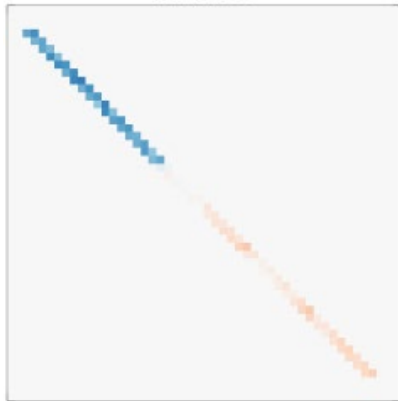


# Contrail + low cloud

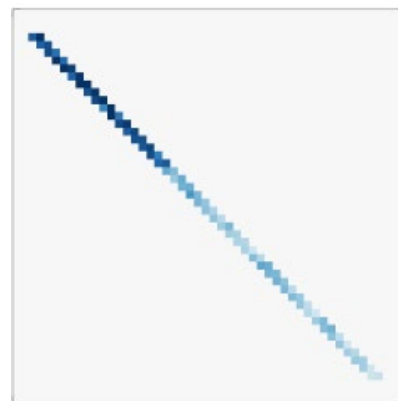
$\tau \approx 10$



RF



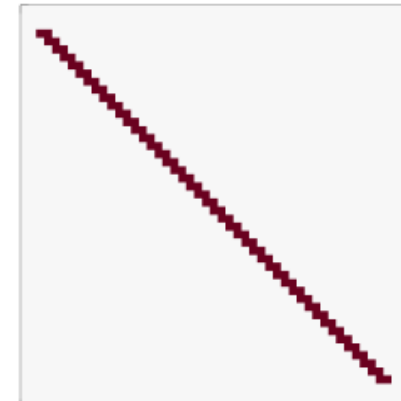
RF



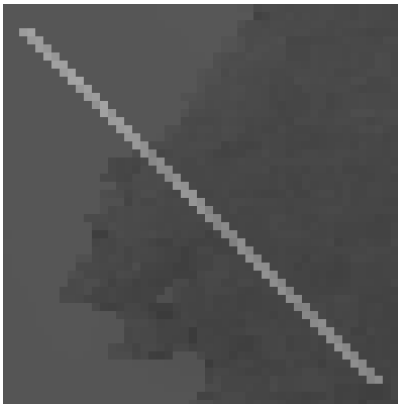
RF



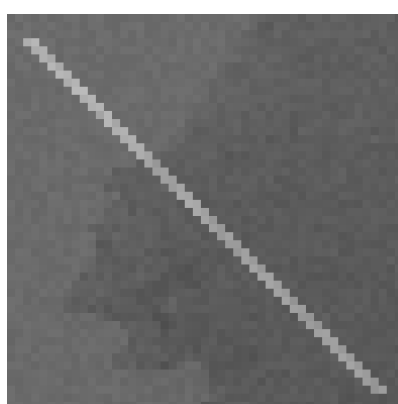
RF



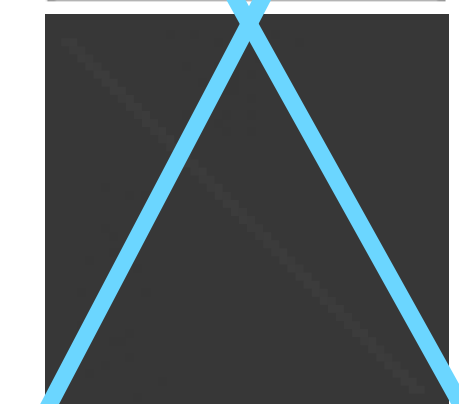
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BTD



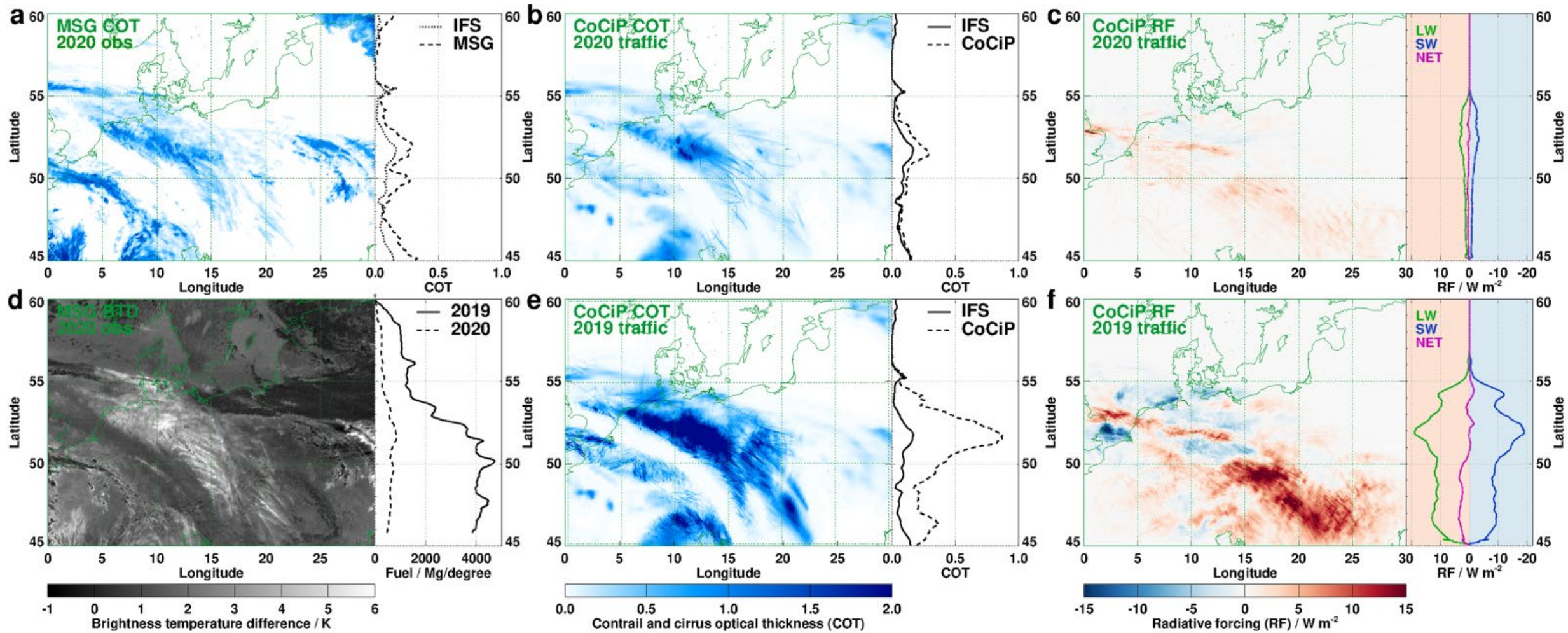
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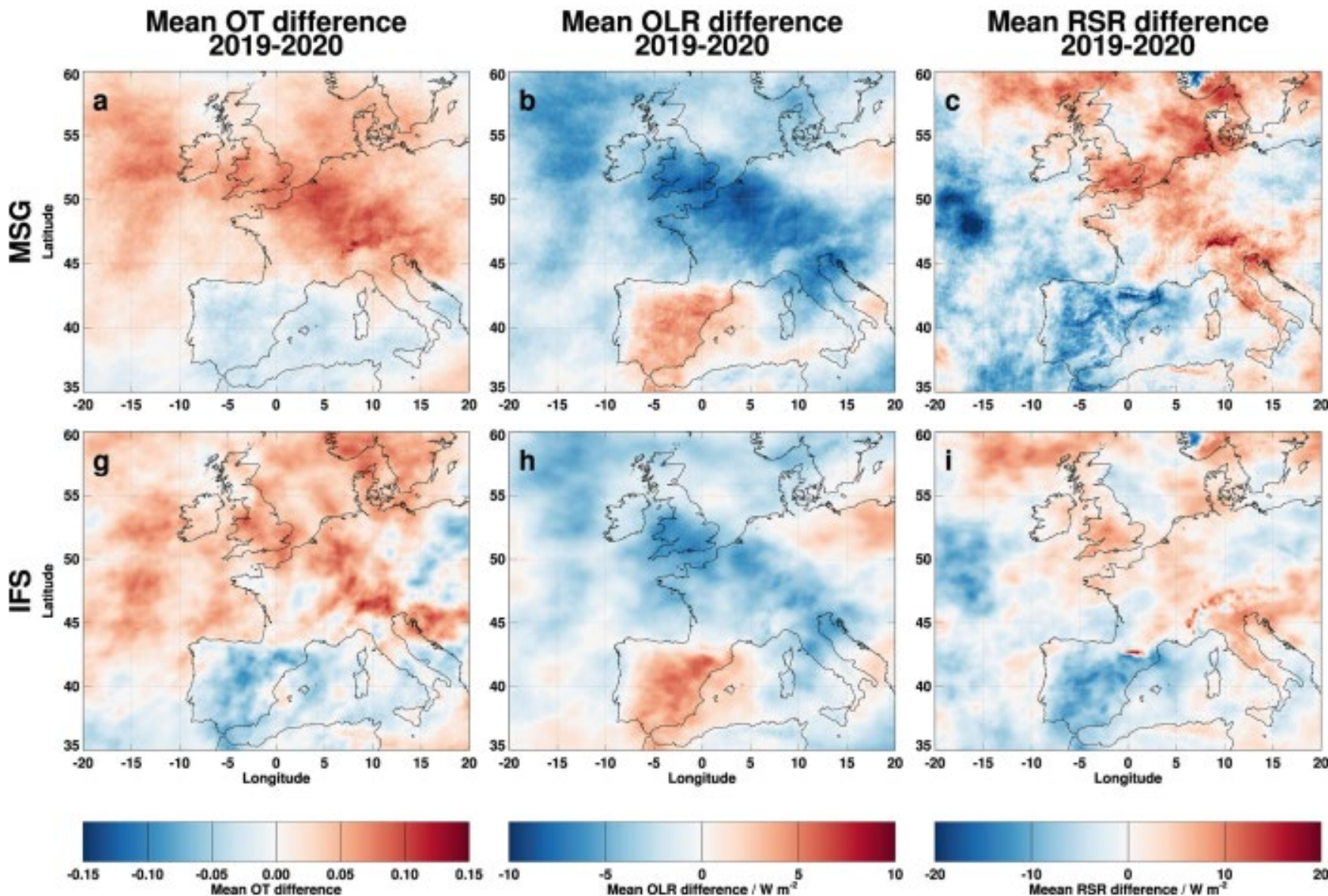
# Passive remote sensing for model evaluation



Voigt et al. (Schumann, Bugliaro) 2022

CoCiP (Schumann 2012) simulations

# Passive remote sensing for model evaluation



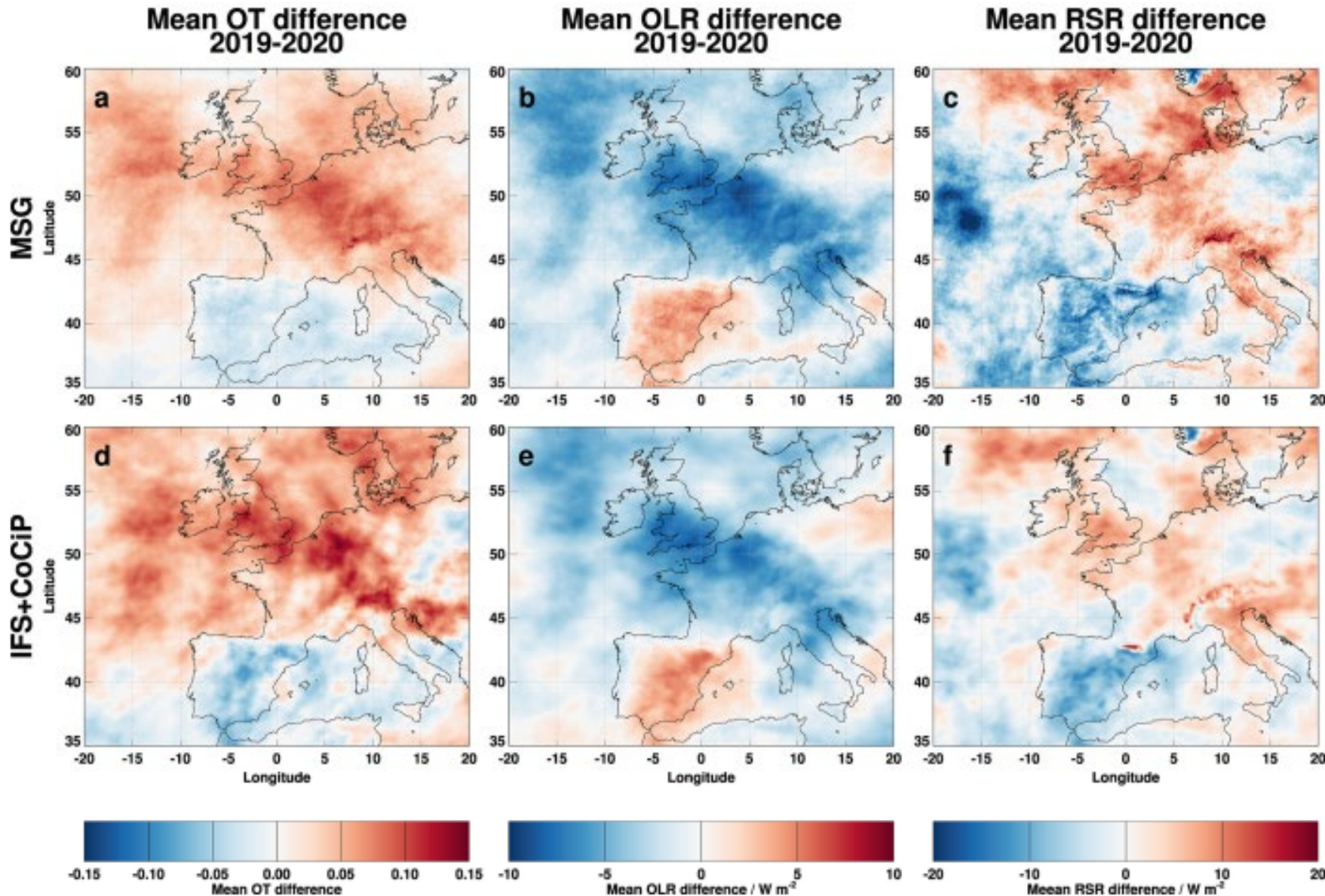
All clouds

Comparison of model simulations and MSG/SEVIRI observations over 6 months in 2019 (high air traffic density) and 2020 (Covid, low air traffic density):

Differences between the year 2019 and 2020

OT: Optical thickness  
OLR: Outgoing Longwave Radiation  
RSR: Reflected Solar Radiation

# Passive remote sensing for model evaluation



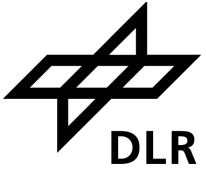
All clouds

Comparison of model simulations and MSG/SEVIRI observations over 6 months in 2019 (high air traffic density) and 2020 (Covid, low air traffic density):

Differences between the year 2019 and 2020

Contrails and contrail cirrus increase the agreement between model and observations.

# Conclusions and outlook



- Passive satellite remote sensing is a powerful tool for contrail detection and contrail model evaluation.
- Current geostationary satellites seem to have reached a good spatial resolution for contrail detection.
- However, there are physical limitations on contrail detection.
- Low spatial resolution is a challenge for contrail detection: How far north can we go even with current geostationary satellites?
- Not all persistent contrails have a significant radiative impact: focus of contrail avoidance on „big hits“ is beneficial to ideally exploit satellite observations of contrails (and for climate).
- Contrail detection can also be used to identify ice supersaturated regions (LuFo MEFKON).
- More model evaluation on single contrail basis is needed.

Thank you for your attention!