

Quantifying fossil fuel CO₂ from continuous measurements of APO: a novel approach

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Outline

Introduction

Motivation – why use APO as well/instead of CO?

How? –fossil fuel CO₂ (ffCO₂) quantification method

Results – from Weybourne, UEA/Tacolneston

Conclusions/Next steps...



Introduction

Separating land biosphere and fossil fuel derived atmospheric CO₂ contributions will facilitate **more accurate emissions verification and CO₂ inversions.**

Current 'top-down' ffCO₂ approach:

- High frequency CO measurements combined with low frequency $\Delta^{14}\text{C}$ measurements to determine the ffCO₂ component of atmospheric CO₂ time series (e.g. van der Laan et al. 2010, Graven et al. 2009, Turnbull et al. 2006)
- But applying $\Delta^{14}\text{C}$ method in the UK is problematic, owing to the influence from nuclear power stations.

Motivation for using APO vs. CO measurements

CO as tracer for ffCO₂:

- Dependent on CO:CO₂ fossil fuel emission ratios.
 - highly variable spatially and temporally; not well known.
- Biased by photochemical processes in summer and cannot differentiate fossil fuel from biomass burning/biofuel use.
 - do not affect APO method.

APO as a tracer for ffCO₂:

- APO:CO₂ fossil fuel emission ratios less variable than CO:CO₂ ff emission ratios.
- Invariant to biomass burning and biofuels.
 - Biofuel use predicted to become more widespread in the future.
- Also affected by ocean-atmosphere exchange.
 - Oceanic influence is relatively easy to identify and thus can be removed.

Using APO and CO as tracers for ffCO₂:

- Might provide more accurate quantification of ffCO₂.
- Might mitigate biases associated with any one particular species.

Previous fossil fuel quantification studies

Reference	Location	Species used	ffCO ₂ range	ffCO ₂ uncertainty
van der Laan et al. 2010	Lutjewad/The Netherlands	$\Delta^{14}\text{C}$ and CO	0 – 30 ppm	± 2.5 ppm
Lopez et al. 2013	Paris/France	$\Delta^{14}\text{C}$, CO, NOx and $^{13}\text{CO}_2$	0 – 40 ppm	Not given for most species. ± 1 ppm for $\Delta^{14}\text{C}$
Graven et al. 2009	California/USA	$\Delta^{14}\text{C}$ and CO	0 – 10 ppm	$\pm 1.6 - 2.9$ ppm
Turnbull et al. 2006	New England and Colorado/USA	$\Delta^{14}\text{C}$, CO and SF ₆	0 – 15 ppm	$\pm 2 - 4$ ppm

APO ffCO₂ quantification method

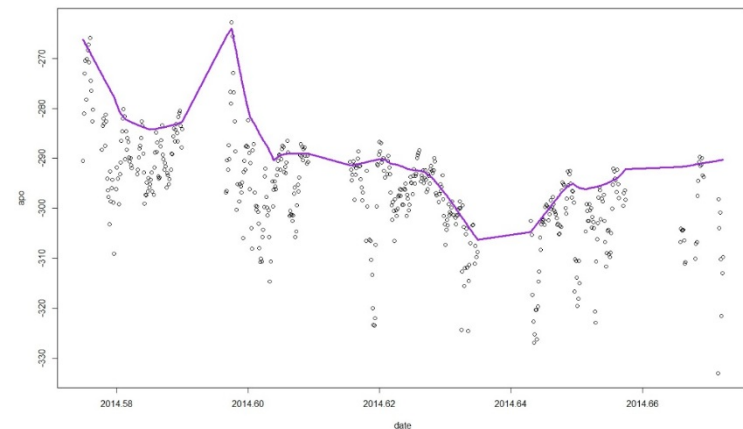
$$ffCO_2(APO) = \frac{APO_{meas} - APO_{bg}}{R_{APO}}$$

where R_{APO} is the APO:CO₂ ratio for fossil fuel combustion.

R_{APO} depends on **fuel type**:

- values range from 0.1 to 0.9.

- APO_{bg} determined using **'Rfbaseline' function** in R (Ruckstuhl et al. 2012):
 - Statistical method based on robust local regression.
 - applies asymmetrical weighting to residuals.



APO ffCO₂ quantification method

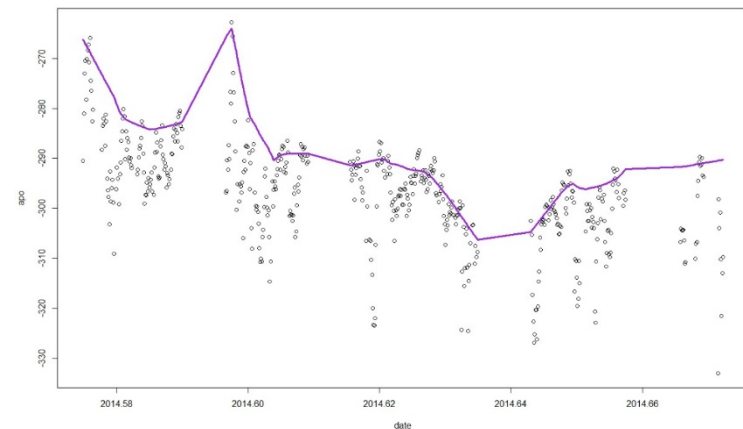
$$ffCO_2(CO) = \frac{CO_{meas} - CO_{bg}}{R_{CO}}$$

where R_{CO} is the CO:CO₂ ratio for fossil fuel combustion.

R_{CO} depends on **fuel type**:

- values typically range from 5 – 25 but can be much higher/lower

- APO_{bg} determined using **'Rfbaseline' function** in R (Ruckstuhl et al. 2012):
 - Statistical method based on robust local regression.
 - applies asymmetrical weighting to residuals.



R_{APO} and R_{CO} from inventories and NAME

COFFEE (**CO**₂ release and **O**xygen uptake from **F**ossil **F**uel **E**missions **E**stimate) dataset used to calculate APO:CO₂ fossil fuel emissions ratios:

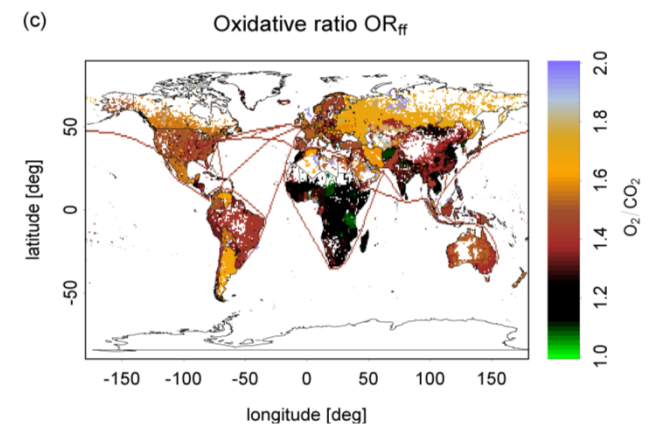
- gridded global O₂:CO₂ ratios (available for 2008, but update is in progress).

Made gridded CO:CO₂ ff ratios from **EDGAR** (**E**missions **D**atabase for **G**lobal **A**tmospheric **R**esearch – for European emissions)

Combine **COFFEE** derived gridded APO:CO₂ ff ratios and EDGAR derived CO:CO₂ ff ratios with UK Met Office **NAME** (**N**umerical **A**tmospheric **D**ispersion **M**odelling **E**nvironment) footprints to determine temporally varying R_{APO} and R_{CO} .

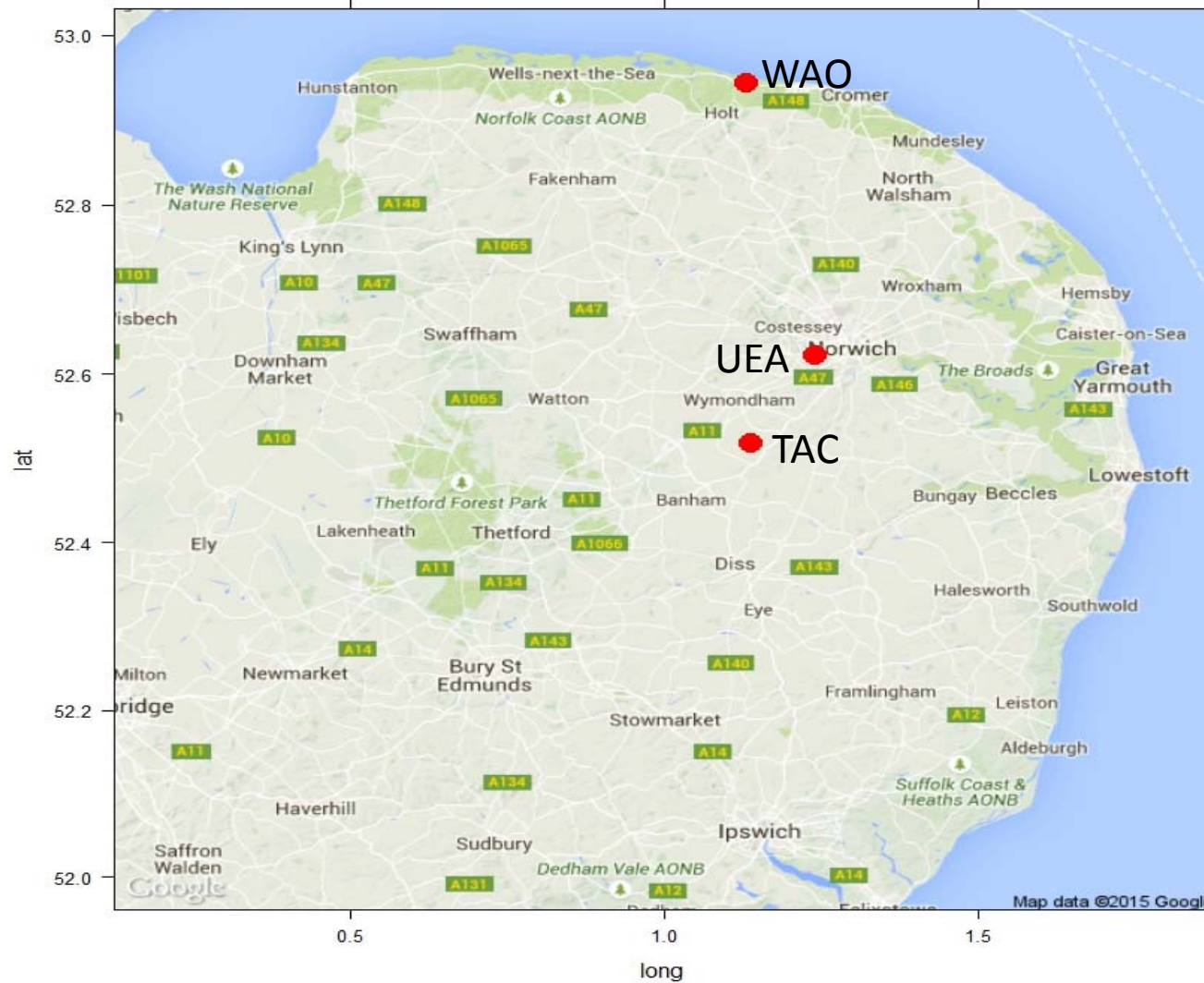
Extras:

- **Reduce oceanic influence** on ffCO₂(APO):
 - filtering out periods that contain APO variation with no corresponding CO₂ variation.
- **Check for atmospheric boundary layer diurnal variability influence** on both APO and CO data.



From Steinbach et al. 2011

Data: Weybourne Observatory (WAO), Tacolneston tall tower (TAC) and UEA – August 2014



Advantages and disadvantages: WAO vs ENV/TAC

UEA/TAC:

- **Advantage:** less ocean influence on APO.
- **Disadvantage:** O₂, CO₂ and CO measurements are not co-located.

WAO:

- **Advantage:** co-located O₂, CO₂ and CO measurements.
- **Disadvantage:** more potential for ocean influence on APO.

ffCO₂ from $\Delta^{14}\text{C}$ data provided by Angelina Wenger (Bristol):

- ~ weekly flask measurements from Tacolneston
- ~40% of data are affected by nuclear power plant influences.

Quantifying uncertainties: measurement uncertainty

CO₂ hourly measurement uncertainty (u_{CO_2}):

- ± 0.47 ppm for UEA and ± 1.01 ppm for WAO.

O₂ hourly measurement uncertainty (u_{O_2}):

- ± 3.48 per meg for UEA and ± 6.80 per meg for WAO.

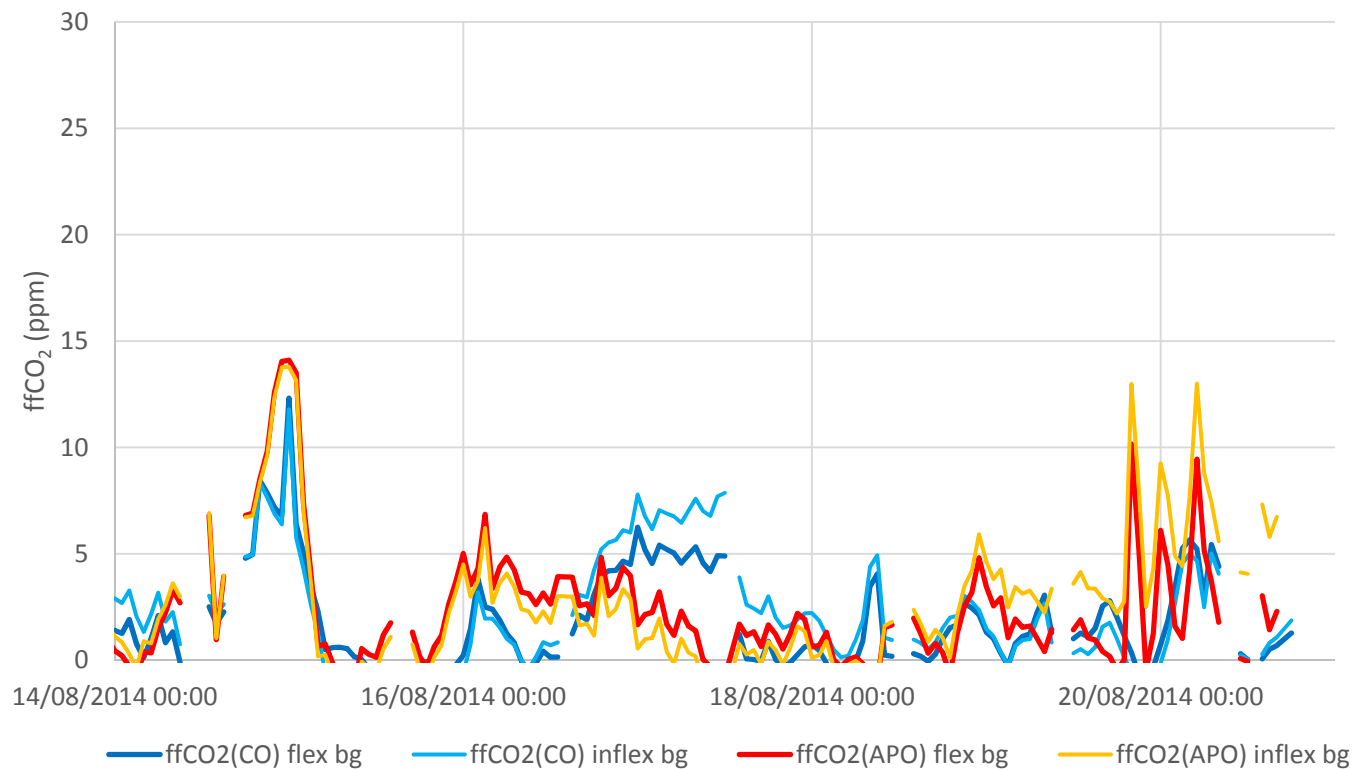
CO hourly measurement uncertainty (u_{CO}):

- **± 5.54 ppb for TAC and ± 1.58 ppb for WAO.**

APO uncertainty (u_{APO}), calculated by quadrature sum of uncertainties:

- $\text{APO} \pm u_{\text{APO}} = \text{O}_2 \pm u_{\text{O}_2} - (1.1 \pm u_{\alpha\text{B}} / 0.2095)(350 - \text{CO}_2 \pm u_{\text{CO}_2})$
- Where $u_{\alpha\text{B}}$ represents the uncertainty associated with the assumed ratio of O₂:CO₂ biosphere exchange (I used $u_{\alpha\text{B}} = \pm 0.05$).
- **Gives mean value of ± 13.8 per meg for UEA and ± 12.35 per meg for WAO.**

Quantifying uncertainties: baseline uncertainty



Data are from ENV/TAC. Assume **20% error in CO_{bg}** and **APO_{bg}**

Quantifying uncertainties: ff emission ratio uncertainty

Calculated by dividing the emission ratio for each time stamp by the 1 σ standard deviation of all the ratios in the footprint.

CO:CO₂ ff uncertainty (u_{RCO}):

- ~75 %

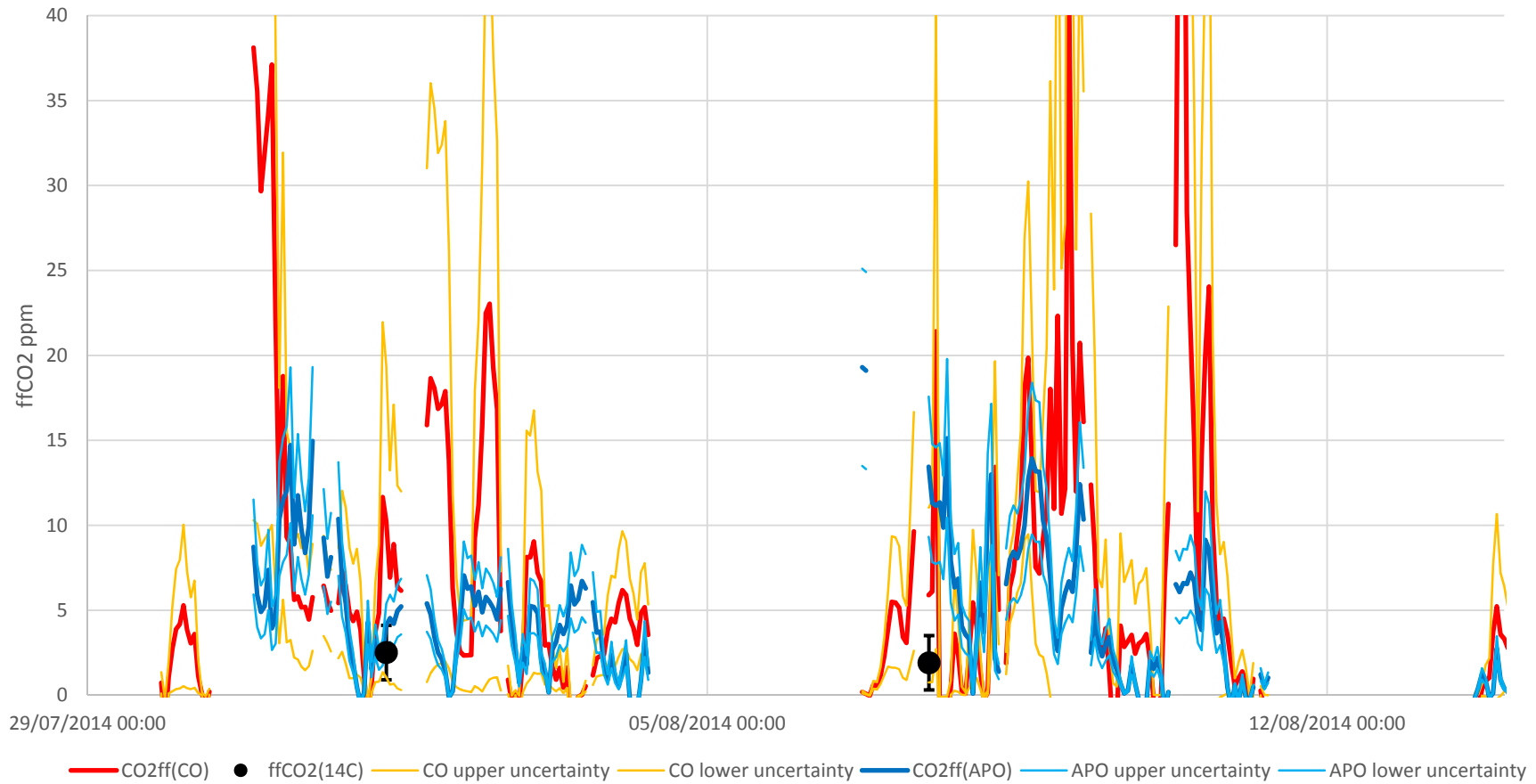
APO:CO₂ ff uncertainty (u_{RAPO}):

- ~21 %

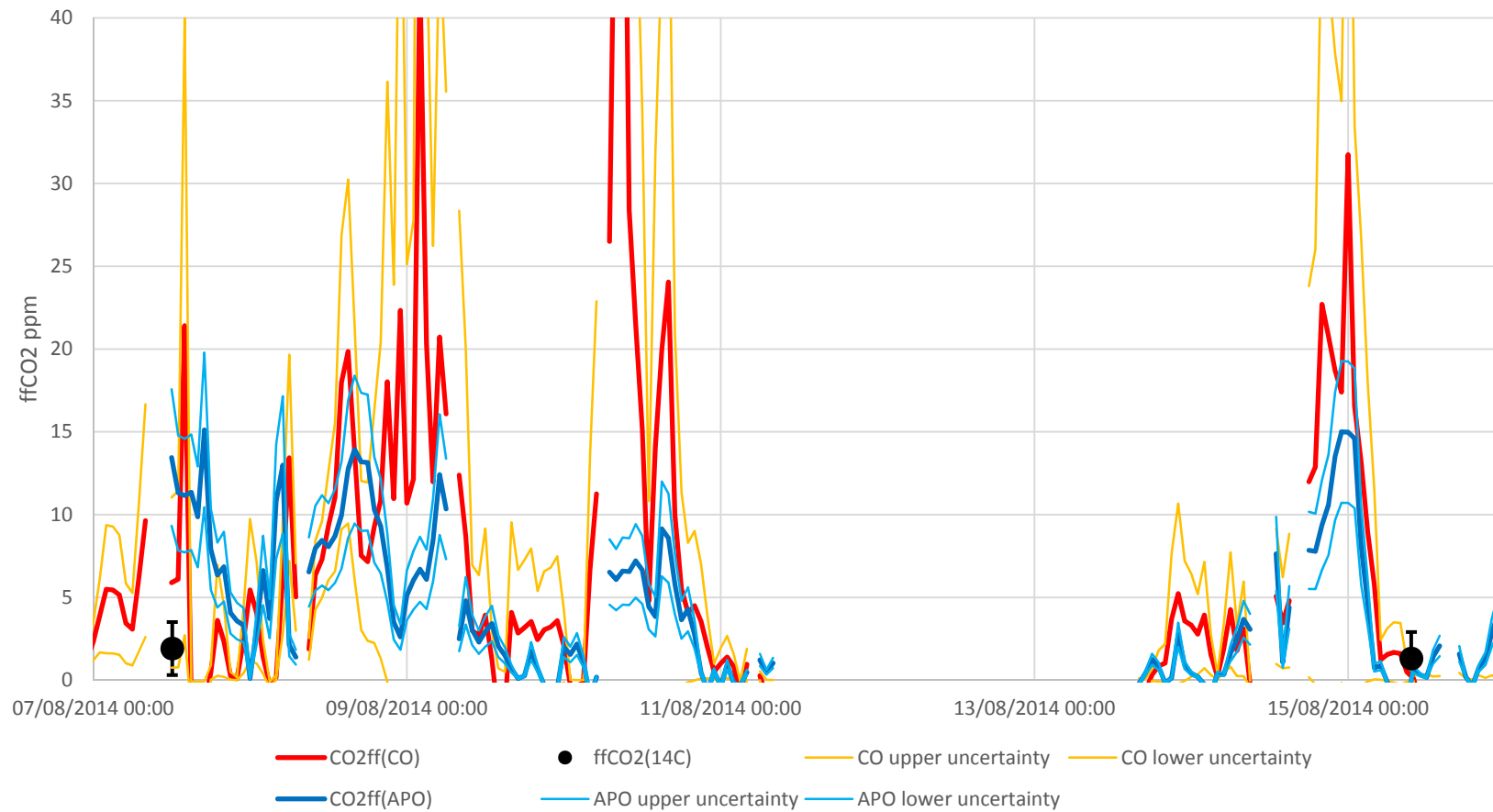
APO:CO₂ emission ratio uncertainty is much less than CO:CO₂ emission ratio uncertainty.

$$ffCO_2(APO) \pm u_{ff(APO)} = \frac{(APOm_{eas} \pm uAP_o) - (APObg \pm ubg)}{R_{APO} \pm u_{RAPO}}$$

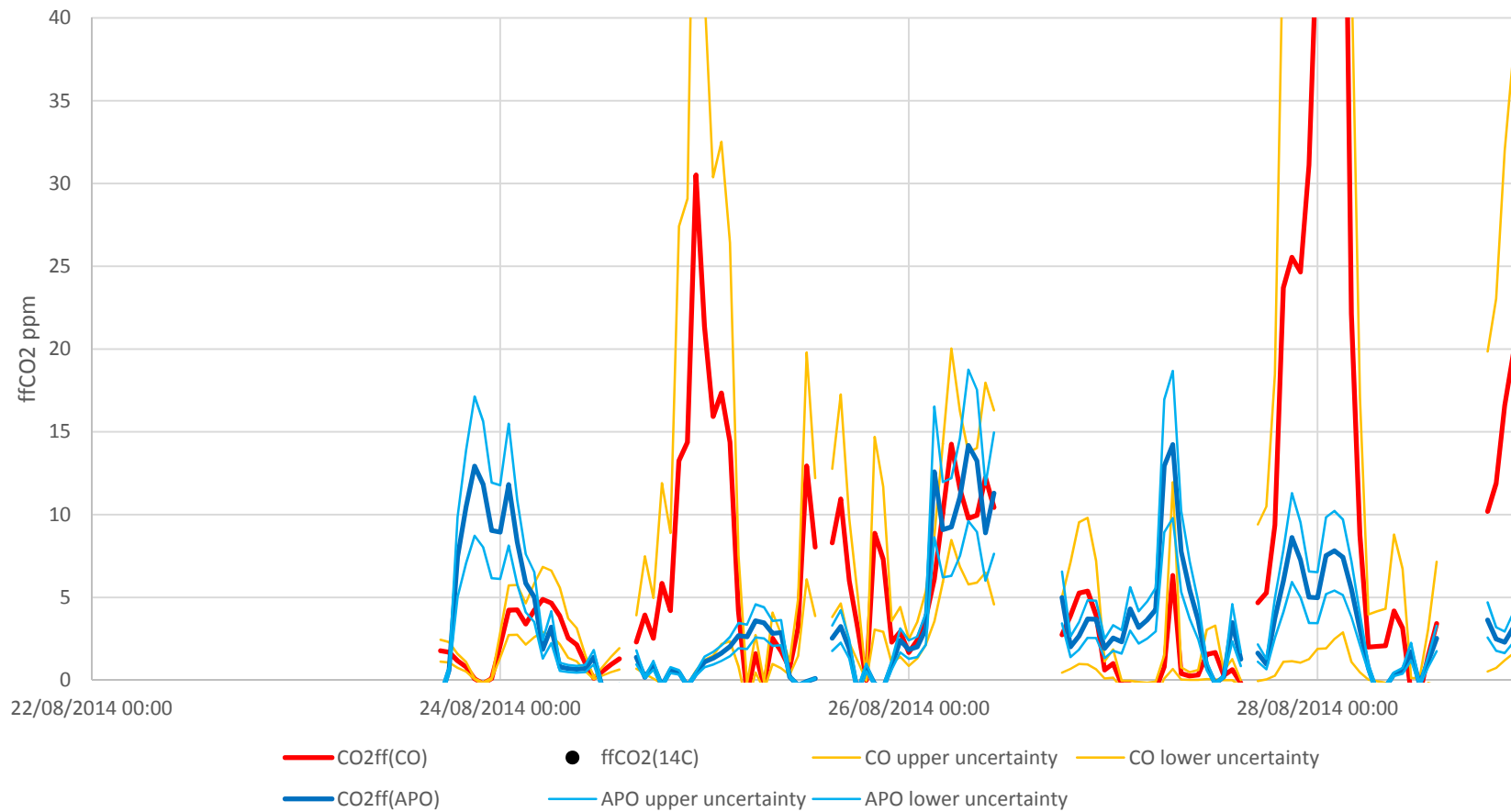
Results: UEA/TAC



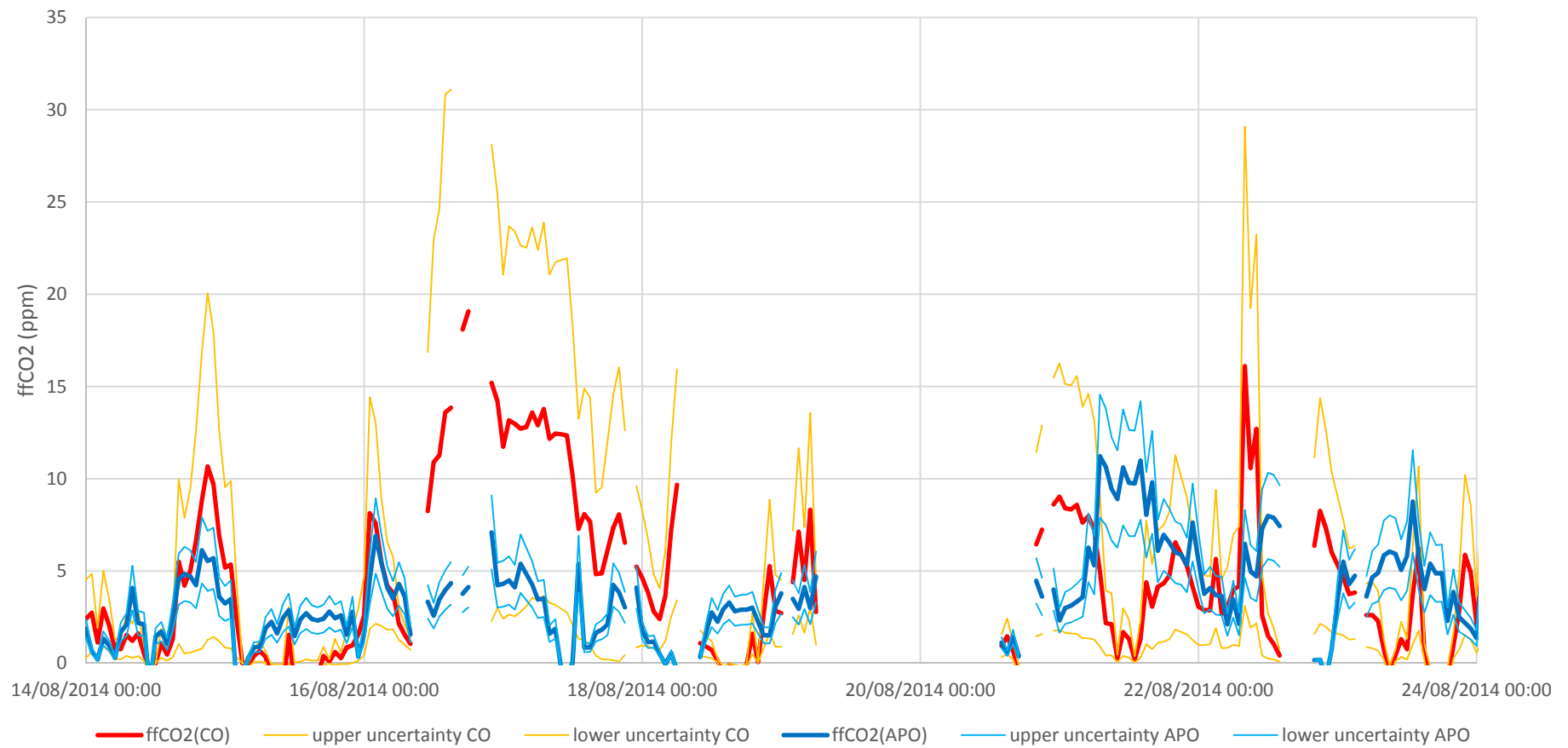
Results: UEA/TAC



Results: UEA/TAC



Results: WAO

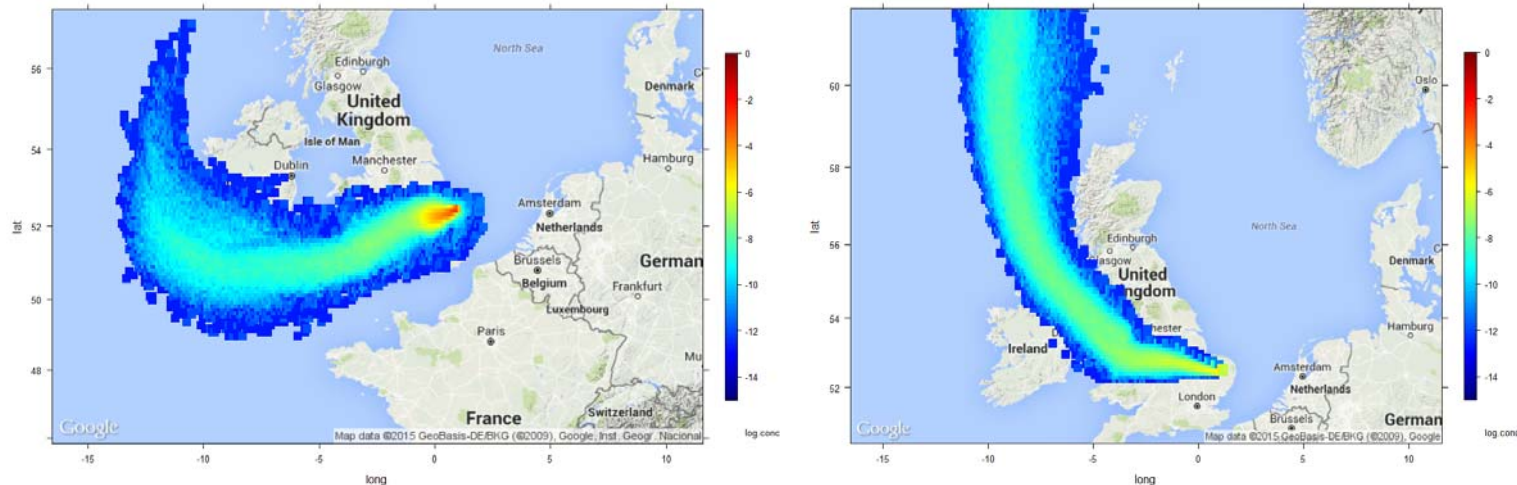


$^{14}\text{CO}_2$ as a constraint on CO and APO methods

Date/time	ffCO ₂ ($^{14}\text{CO}_2$ method) in ppm	ffCO ₂ (CO method) in ppm	ffCO ₂ (APO method) in ppm
01/08/2014 09:01	2.51 ± 1.6	10.21 ± 9.2	4.13 ± 1.3
07/08/2014 12:06	1.91 ± 1.6	5.90 ± 5.1	13.44 ± 4.1
15/08/2014 09:40	1.30 ± 1.6	0.11 ± 0.1	0.67 ± 0.2
21/08/2014 08:40	1.19 ± 1.6	-	-
29/08/2014 11:20	2.51 ± 1.6	-	-

Periods of disparity between CO and APO methods

- See similar signals but not same magnitude – largely due to differences in emission ratios.
- UEA/TAC measurements are not co-located.
- CO has relatively short life-time in summer.



CO vs. APO vs. 14CO₂

WAO:

	Mean ff CO ₂ (ppm)	St dev ff CO ₂ (ppm)	Mean uncertainty (ppm)	Mean uncertainty (%)
CO	5.59	6.12	4.52	75.8
APO	3.71	2.62	1.14	29.9

UEA/TAC:

	Mean ff CO ₂ (ppm)	St dev ff CO ₂ (ppm)	Mean uncertainty (ppm)	Mean uncertainty (%)
CO	6.35	8.99	5.78	81.4
APO	3.98	4.00	1.24	30.0
14CO ₂	2.02	0.66	1.60	87.9

Reference	Location	Species used	ffCO ₂ range	ffCO ₂ uncertainty
van der Laan et al. 2010	Lutjewad/The Netherlands	¹⁴ CO ₂ and CO	0 – 30 ppm	± 2.5 ppm
Lopez et al. 2013	Paris/France	¹⁴ CO ₂ , CO, NO _x and ¹³ CO ₂	0 – 40 ppm	Not given for most species. ± 1 ppm for ¹⁴ CO ₂
Graven et al. 2009	California/USA	¹⁴ CO ₂ and CO	0 – 10 ppm	± 1.6 – 2.9 ppm
Turnbull et al. 2006	New England and Colorado/USA	¹⁴ CO ₂ , CO and SF ₆	0 – 15 ppm	± 2 – 4 ppm
This work	Norfolk/UK	CO	0 – 70 ppm (TAC)	± 5.78 (TAC)
			0 – 40 ppm (WAO)	± 4.52 (WAO)
		APO	0 – 15 ppm (UEA)	± 1.24 (UEA)
			0 – 13 ppm (WAO)	± 1.14 (WAO)
		¹⁴CO₂	1.2 – 2.5 ppm (TAC)	± 1.60 (TAC)



Conclusions and next steps

- CO and APO methods show similar variability at each site most of the time, but not always.
- CO method likely over-estimates ffCO₂.
- ¹⁴CO₂ method likely under-estimates total ffCO₂ due to 'clean air sampling'.
- About 40% of the ¹⁴CO₂ data are severely affected by nuclear power plant influences.
- Uncertainty using APO method is much smaller than using CO method.
- Periods when both methods show strong agreement gives very high confidence.

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- more investigation of **baseline uncertainty**.
 - Use NAME to **identify ffCO₂ sources**, e.g. Norwich, London, Birmingham, Europe, and also differentiate between fuel types using COFFEE.
 - Masters' student Ben Evans will do similar analysis using continuous MHD data.