

# Comparison of crop yield sensitivity to ozone between open-top chamber and free-air experiments

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## Abstract

Assessments of the impacts of ozone (O<sub>3</sub>) on regional and global food production are currently based on results from experiments using open-top chambers (OTCs). However, there are concerns that these impact estimates might be biased due to the environmental artifacts imposed by this enclosure system. In this study, we collated O<sub>3</sub> exposure and yield data for three major crop species—wheat, rice, and soybean—for which O<sub>3</sub> experiments have been conducted with OTCs as well as the ecologically more realistic free-air O<sub>3</sub> elevation (O<sub>3</sub>-FACE) exposure system; both within the same cultivation region and country. For all three crops, we found that the sensitivity of crop yield to the O<sub>3</sub> metric AOT40 (accumulated hourly O<sub>3</sub> exposure above a cut-off threshold concentration of 40 ppb) significantly differed between OTC and O<sub>3</sub>-FACE experiments. In wheat and rice, O<sub>3</sub> sensitivity was higher in O<sub>3</sub>-FACE than OTC experiments, while the opposite was the case for soybean. In all three crops, these differences could be linked to factors influencing stomatal conductance (manipulation of water inputs, passive chamber warming, and cultivar differences in gas exchange). Our study thus highlights the importance of accounting for factors that control stomatal O<sub>3</sub> flux when applying experimental data to assess O<sub>3</sub> impacts on crops at large spatial scales.

## KEYWORDS

crop yield, FACE, open-top chamber, ozone, sensitivity

## 1 | INTRODUCTION

Tropospheric ozone (O<sub>3</sub>) is one of the most detrimental air pollutants for vegetation at the global scale (Ainsworth, Yendrek, Sitch, Collins, & Emberson, 2012; Fuhrer et al., 2016; Paoletti, 2007). Current

ambient O<sub>3</sub> concentrations are estimated to cause yield losses of 5%–19% in major food crops such as wheat, soybean, rice, potato, barley, and bean (Feng & Kobayashi, 2009; Osborne et al., 2016). Background O<sub>3</sub> concentrations have at least doubled since the pre-industrial level (Cooper et al., 2014) and projected climate change

are expected to further increase concentrations by 0.5%–2% per decade during this century if the current emissions of O<sub>3</sub> precursors are maintained (Solomon et al., 2007).

Our knowledge on O<sub>3</sub> impacts on crop production is largely based on field experiments using mainly two types of experimental exposure systems: open-top chambers (OTC) and free-air O<sub>3</sub> concentration elevation (O<sub>3</sub>-FACE). To date, more OTC experiments than O<sub>3</sub>-FACE experiments have been carried out, mostly as a consequence of the considerably larger costs of the latter type of experiments. Based on the OTC experiments, dose–response relationships have been derived for several key crop species (Feng, Hu, Wang, Jiang, & Liu, 2015; Mills et al., 2007) and these relationships have been used for current estimates of O<sub>3</sub>-induced crop yield losses at regional or global scales (Avnery, Mauzerall, Liu, & Horowitz, 2011a, 2011b; Van Dingenen et al., 2009). However, there have been concerns regarding the ecological realism of effects observed in OTC experiments due to the environmental artifacts imposed by the chamber enclosures (Ainsworth et al., 2012; Long, Ainsworth, Leakey, & Morgan, 2005; Zhu et al., 2011). Several environmental variables are altered inside the OTCs, including air turbulence, light intensity, and air temperature and humidity. The O<sub>3</sub> concentration is vertically uniform inside OTCs, and the leaf boundary layer resistance is low due to the high and constant turbulence caused by the chamber ventilation. These experimental artifacts likely promote increased O<sub>3</sub> uptake by plant leaves, which in turn has been suggested to lead to overestimation of O<sub>3</sub> impacts in OTC experiments compared to those occurring at similar top-of-canopy O<sub>3</sub> concentrations in the field (Nussbaum & Fuhrer, 2000). However, another environmental artifact may act in the opposite direction. The temperature inside OTCs may be up to 3°C higher than the outside air at noon (Leady & Drake, 1993). The warmer air inside OTCs typically has higher vapor pressure deficit (VPD), which likely leads to lower stomatal conductance and O<sub>3</sub> uptake, and thus a potential underestimation of O<sub>3</sub> impacts (Piikki, De Temmerman, Hogy, & Pleijel, 2008).

FACE is commonly considered as an ideal approach to study the responses of plants and ecosystems to elevated CO<sub>2</sub> or O<sub>3</sub> due to its small environmental artifacts (Ainsworth et al., 2012; Long et al., 2005). FACE exposure systems do not interfere with the energy and gas exchange of the plant canopy, and plant responses to elevated gas concentrations should therefore be similar to those in the natural environment. However, FACE experiments inherently require large resources with respect to funding, infrastructure, and technological know-how. So far, there are only two O<sub>3</sub>-FACE systems of large size (>14 m in plot diameter) in the world to investigate the effects of O<sub>3</sub> on crops: one in China for wheat and rice, and another one in USA for soybean. Another disadvantage of FACE experiments is that they cannot decrease the O<sub>3</sub> concentration and thus not assess plant responses to current ambient levels. This can be achieved by air filtration treatments in OTC experiments.

Meta-analyses of CO<sub>2</sub> impacts on crop yield have estimated that CO<sub>2</sub>-induced crop yield stimulation is considerably smaller in FACE experiments than in experiments with plants in chambers (Long

et al., 2005; Wang, Feng, & Schjoerring, 2013) although a recent synthesis challenged this finding (Bishop, Leakey, & Ainsworth, 2014). There have been no similar multi-crop meta-analyses for O<sub>3</sub> impacts on crops, and we therefore do not know if the O<sub>3</sub> effects observed in OTC experiments differ from those found in the more ecologically realistic O<sub>3</sub>-FACE experiments. This hampers the credibility of current estimates of O<sub>3</sub>-induced crop yield losses, which rely on dose–response relationships based on data from OTC experiments (Avnery et al., 2011a, 2011b; Van Dingenen et al., 2009). The aim of this study was to close this knowledge gap by comparing the effects of O<sub>3</sub> on wheat, rice, and soybean observed in OTC and O<sub>3</sub>-FACE experiments.

## 2 | MATERIALS AND METHODS

### 2.1 | Data collection

This analysis explored the relationship between O<sub>3</sub>-induced relative yield and the commonly used O<sub>3</sub> index AOT40 (accumulated hourly O<sub>3</sub> exposure above a cutoff threshold concentration of 40 ppb). We included only crop species for which field experiments have been conducted with both OTC and O<sub>3</sub>-FACE exposure systems: wheat, rice, and soybean. Osborne et al. (2016) indicated that the O<sub>3</sub> sensitivity may differ among regions (countries) of the experiments. To minimize confounding influences of regional differences in climate, cultivars and management practices, OTC data of a given species were only included if coming from the same region as the O<sub>3</sub>-FACE data of that species. Thus, wheat and rice data were taken from China and soybean data from the United States. Data were searched from the Web of Science (Thompson-ISI, Philadelphia, PA, USA) and the criteria for inclusion were as follows:

1. Plants must have been rooted in the field rather than in pots.
2. Only OTC and O<sub>3</sub>-FACE experiments were included; experiments conducted with other exposure systems were not considered.
3. For experiments which included additional non-O<sub>3</sub> treatments (e.g., drought, N fertilization, elevated CO<sub>2</sub>), only data from the control and the single O<sub>3</sub> treatment(s) were used.
4. Ozone exposure must have been presented as the seasonal mean 7-hr (M7), 8-hr (M8), or 12-hr (M12) O<sub>3</sub> concentrations, or as AOT40. For experiments not reporting AOT40 values, these were estimated from M7, M8, or M12 data using conversion equations provided by Osborne et al. (2016).
5. The duration of O<sub>3</sub> exposure in soybean and rice must have spanned at least 60% of the total growing season, which is approximately from 3 to 4 months from sowing to maturity in rice and soybean (Pedersen & Lauer, 2004). This criterion was not applied to winter wheat, which was sown late in the preceding year and exposed to elevated O<sub>3</sub> usually from March through to the end of May.
6. Yield must have been measured directly, as the total harvested grain or seed mass.

The literature search found 18 studies meeting these criteria (Table 1). Based on our selection criteria, we built a database comprising 270 data points (i.e., site  $\times$  species  $\times$  cultivar  $\times$  treatment  $\times$  year combinations). Wheat, rice, and soybean data contributed 55, 44, and 171 data points, respectively, from 3, 3, and 12 experiments conducted with 8, 8, and 16 cultivars, respectively (Table 1).

## 2.2 | Data analysis

First, the  $O_3$  dose was determined on an AOT40 basis. For wheat and rice, daytime hourly  $O_3$  concentration above a threshold of 40 ppb was integrated throughout the period of 55 days (wheat) and 80 days (rice), ending at 6–7 days before maturity harvest for consistency in the period of AOT40 calculation between  $O_3$ -FACE (Zhu et al., 2011) and OTC experiments (Wang et al., 2012). For soybean, 90 days AOT40 accumulation period was used.

Second, the following model of yield response to  $O_3$  dose was applied:

$$y = Z(1 - Sd), \quad (1)$$

where  $y$  is the crop yield,  $Z$  is the yield at zero  $O_3$  dose, and  $S$  is the relative sensitivity of the crop yield to the  $O_3$  dose ( $d$ ). The multiplicative model of Equation (1) is converted to an additive model by taking natural logarithm of the both sides:

$$\ln y = \ln Z + \ln(1 - Sd). \quad (2)$$

The sensitivity parameter  $S$  can be estimated by fitting the following model iteratively to the observations:

$$\ln y_{ij} = \ln Z_i + \ln(1 - Sd_{ij}) + \varepsilon_{ij}, \quad (3)$$

where  $y_{ij}$  is the crop yield at  $j$ th level of  $O_3$  treatment in  $i$ th experiment,  $Z_i$  is the crop yield at zero  $O_3$  dose in  $i$ th experiment,  $d_{ij}$  is the  $O_3$  dose at  $j$ th level of  $O_3$  treatment in  $i$ th experiment, and  $\varepsilon_{ij}$  is the random error. Note that, in Equation (3),  $Z_i$  and  $S$  can be estimated simultaneously as opposed to the often used two-step procedure (e.g., Osborne et al., 2016), in which  $Z_i$  and experiment-specific  $S_i$  is first estimated for individual experiments, and  $S$  is determined across the datasets in a second step. Such procedure is operationally simple, but theoretically problematic due to the inconsistency between the sensitivity estimates used for the first and the second steps. See Appendix S1 for more discussions on the theoretical problem of the two-step procedure.

Third, the above model fitting is used to test the difference of the sensitivity  $S$  between OTC and  $O_3$ -FACE as follows. Denoting the sensitivity  $S$  for OTC and  $O_3$ -FACE experiments as  $S_o$  and  $S_f$ , respectively, and the  $O_3$  dose for OTC and  $O_3$ -FACE experiments as  $d_o$  and  $d_f$ , respectively, Equation (3) can be written as

$$\ln y_{ij} = \ln Z_i + \ln(1 - S_o d_{oij}) + \ln(1 - S_f d_{fij}) + \varepsilon_{ij}, \quad (4)$$

where  $d_{oij} = d_{ij}$  for OTC experiments and  $d_{oij} = 0$  for  $O_3$ -FACE experiments, and  $d_{fij} = d_{ij}$  for  $O_3$ -FACE experiments and  $d_{fij} = 0$  for

OTC experiments. If OTC and  $O_3$ -FACE experiments share the same sensitivity (i.e.,  $S_o = S_f = S_c$ ) Equation (4) can be simplified as:

$$\ln y_{ij} = \ln Z_i + \ln(1 - S_c d_{ij}) + \varepsilon_{ij}. \quad (5)$$

The comparison of the above two models can be formulated such that Equation (5) represents the null hypothesis ( $S_o = S_f$ ) and Equation (4) represents the alternative hypothesis ( $S_o \neq S_f$ ). The test statistic ( $T$ ) based on the likelihood ratio is defined as:

$$T = -2 \ln(L_o/L_a), \quad (6)$$

where  $L_o$  is the maximum likelihood for the model fitted with Equation (5) and  $L_a$  is the maximum likelihood for the model fitted with Equation (4). The test statistic asymptotically follows the Chi-square distribution with the degree of freedom = 1 (i.e., the difference between Equations (4) and (5) in the number of parameters), and the  $p$  value for the Type-I error is calculated accordingly.

In this study, the sensitivity parameter  $S$  in Equation (3) was estimated by iteratively fitting a linear model to the observations with JMP software (SAS Institute, Cary, USA). Linear relationships were fitted for all crop species and for both OTC and  $O_3$ -FACE data, since adding a quadratic term did not significantly improve any of the relationships. See Appendix S2 for details of the estimation of the model parameters in Equation (2) with the linear model fitting. The maximum likelihood ( $L_o$  and  $L_a$  in Equation 6) was calculated from the output of the software.

## 3 | RESULTS AND DISCUSSION

This study is to our knowledge the first multi-species comparison of  $O_3$  impacts reported from OTC versus  $O_3$ -FACE experiments. For all the three crops, the model with common sensitivity between  $O_3$ -FACE and OTC was rejected (Table 2).

For soybean (Figure 1a, Table 2), the sensitivity in OTC was greater than that in  $O_3$ -FACE experiments, whereas the opposite was the case for wheat and rice (Figure 1b,c, Table 2). These results indicate that current yield loss estimates (Avnery et al., 2011a, 2011b; Van Dingenen et al., 2009) based on AOT40 dose–response relationships from OTCs may be biased, positively or negatively depending on crop species. Since results were species-specific we will now discuss them species by species.

For soybean, the greater sensitivity to  $O_3$  in OTC than  $O_3$ -FACE was likely caused by differences in water supply. Plants in all the OTC experiments but one (Mulchi, Lee, Tuthill, & Olinick, 1988) were irrigated, whereas those in  $O_3$ -FACE were not. In the non-irrigated fields of  $O_3$ -FACE, the soybean plants were likely frequently subjected to soil moisture deficit (Betzelberger et al., 2010), which should have reduced stomatal conductance and thereby  $O_3$  uptake. Among the 6 years of  $O_3$ -FACE experiments included in the analysis of the present study, 2007 was a particularly dry year with only 233 mm rainfall during the soybean growing season (Table S1), compared to 314–432 mm in the other years. Excluding the dry year of

**TABLE 1** List of experiments included in the analysis, with information on crop species and cultivar, exposure system, experimental year, O<sub>3</sub> treatments, location, and reference

Crops	Exposure system	Cultivar	Experimental year	O <sub>3</sub> treatment	Location	Reference
Wheat	OTC	Yangmai 185 Jia 002	2004 <sup>a</sup> 2006–2008	CF, NF, E-O <sub>3</sub>	121°18E 31°53N Jiaxing, China	Wang et al. (2012)
Wheat	OTC	Beinong 9549	2010	NF, E-O <sub>3</sub>	116°08E 40°12N Changping China	Tong et al. (2012)
Wheat	FACE	Yangmai 15, Yangmai 16, Yangfumai 2 Yannong 9 Jia002	2007–2010	AA, E-O <sub>3</sub>	119°42E 32°35N Jiangdou China	Feng et al. (2012)
Rice	OTC	Jiahua2 Fan3694	2004 <sup>a</sup> –2005, 2006–2008	CF, NF, E-O <sub>3</sub>	121°18E 31°53N Jiaxing, China	Wang et al. (2012)
Rice	OTC	Yuejingsi-2	2009	NF, E-O <sub>3</sub>	113°45'E 23°1'N Guangzhou, China	Tong et al. (2011)
Rice	FACE	Yangdao 6 Shanyou 63 Liangyoupeijiu Wujing 15 Wuyujing 21	2007–2009	AA, E-O <sub>3</sub>	119°42E 32°35N Jiangdou China	Zhang, Tang, Liu, and Zhu (2016)
Soybean	OTC	Essex	1999–2000	CF, E-O <sub>3</sub>	Raleigh USA	Booker, Miller, Fiscus, Pursley, and Stefanski (2005)
Soybean	OTC	Williams Corsoy	1983	CF, NF, NF+30, NF+60, NF+90	Beltsville, USA	Heggestad, Anderson, Gish, and Lee (1988)
Soybean	OTC	Hodgson		CF, NF, NF+30, NF+60, NF+90	Beltsville, USA	Kohut, Amundson, and Laurence (1986)
Soybean	OTC	Amsoy-71, Corsoy-79	1983	CF, NF, NF+30, NF+60,	Argonne, USA	Kress, Miller, Smith, and Rawlings (1986)
Soybean	OTC	Clark	1989	CF, NF, NF+40,	Beltsville, USA	Mulchi, Lee, Tuthill, and Olinick (1988)
Soybean	OTC	Davis	1977, 1978	CF, NF	Raleigh, USA	Heagle, Letchworth, and Mitchell (1983b)
Soybean	OTC	Davis	1981	CF, NF, NF1, NF2, NF3, NF4	Raleigh, USA	Heagle, Heck, Rawlings, and Philbeck (1983a)
Soybean	OTC	Davis	1983, 1984	CF, NF, NF1, NF2, NF3, NF4	Raleigh, USA	Heagle et al. (1987)
Soybean	OTC	Davis	1982	CF, NF, NF+20, NF+40, NF+60; 1.3NF, 1.6NF, 1.9NF	Raleigh, USA	Heagle, Lesser, Rawlings, Heck, and Philbeck (1986)
Soybean	FACE	Dwight, HS93-4118, IA-3010, Loda, LN97-15076, Pana	2007–2008	AA, E-O <sub>3</sub>	88°14W 40°02'N Champaign, USA	Betzberger et al. (2010)

(Continues)

**TABLE 1** (Continued)

Crops	Exposure system		Experimental year	O <sub>3</sub> treatment	Location	Reference
	system	Cultivar				
Soybean	FACE	93B15	2002–2003	AA, E-O <sub>3</sub>	88°14W 40°02'N Champaign, USA	Morgan, Mies, Bollero, Nelson, and Long (2006)
Soybean	FACE	A mixture of Dwight, HS93-4118, IA-3010, Loda, LN97-15076, Pana, Pioneer, 93B15	2009–2010	AA, 40, 55, 70, 85, 110, 130, 160 and 200 ppb	88°14W 40°02'N Champaign, USA	Betzberger et al. (2012)

<sup>a</sup>Observations in rice and wheat subjected to a very high O<sub>3</sub> concentration of 200 ppb for 8 hr daily (Wang et al., 2012) were excluded from the analysis to prevent the anomalously high AOT40 values from exerting overwhelming influence on the estimation of O<sub>3</sub> sensitivity.

**TABLE 2** Comparison between the models with different (Equation 4) and common O<sub>3</sub> sensitivity (Equation 5) of O<sub>3</sub>-FACE and OTC experiments. S<sub>o</sub> is the sensitivity in OTC, S<sub>f</sub> is the sensitivity in FACE, and S<sub>c</sub> is the common sensitivity in both OTC and FACE

Crop species <sup>a</sup>	Different sensitivity		Common sensitivity S <sub>c</sub> <sup>b</sup>	p Value
	S <sub>o</sub>	S <sub>f</sub>		
Soybean	0.0102	0.0090	0.0097	.048
Wheat	0.0215	0.0259	0.0222	.023
Rice	0.0111	0.0203	0.0118	.002

<sup>a</sup>The sensitivities of different crop species are not readily compared since the AOT40 accumulation periods were different (see Section “2”).

<sup>b</sup>The common sensitivity, S<sub>c</sub>, is closer to S<sub>o</sub> than to S<sub>f</sub> due to differences in the number of observations as well as the range of O<sub>3</sub> doses for O<sub>3</sub>-FACE compared to OTC experiments.

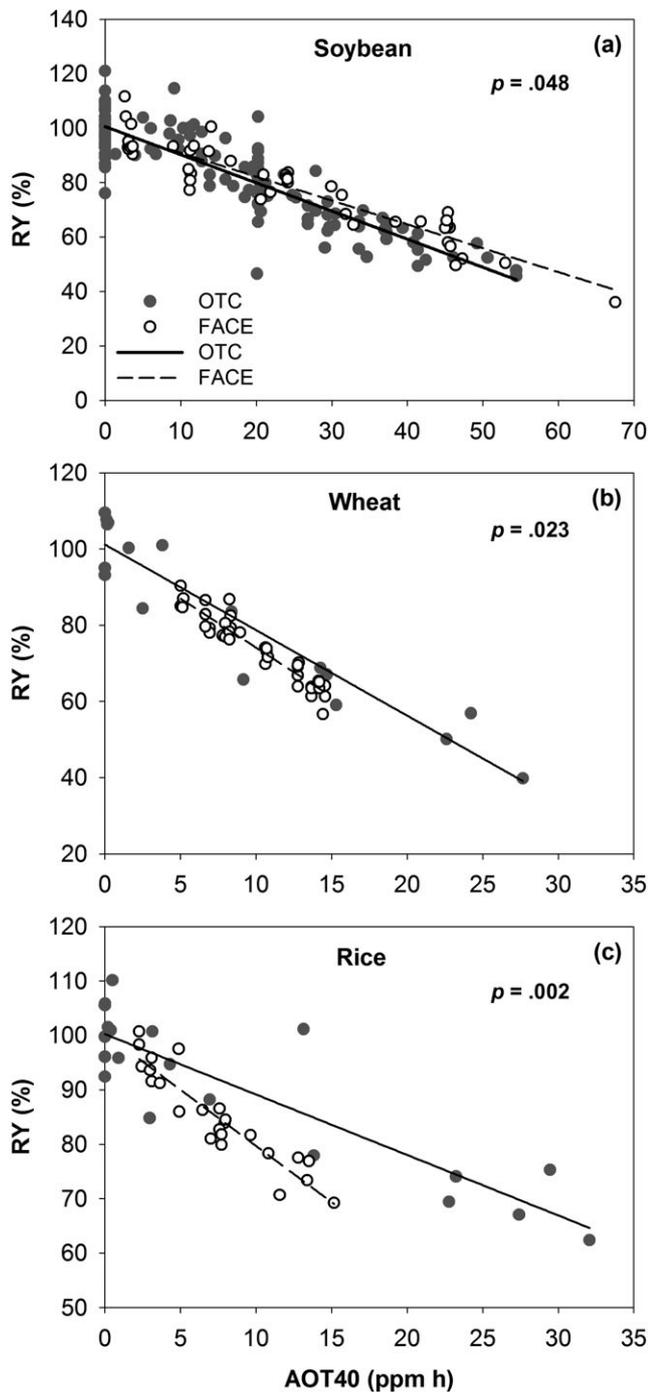
2007 from the analysis, there was a much more similar and statistically indistinguishable ( $p = .37$ ) O<sub>3</sub> sensitivity of O<sub>3</sub>-FACE (0.0098) and OTC (0.0102) experiments. This suggests that the O<sub>3</sub> sensitivity of soybean is similar in OTC and O<sub>3</sub>-FACE experiments, unless the lack of irrigation in O<sub>3</sub>-FACE experiments caused substantial soil water deficits and stomatal closure responses in unusually dry years.

It is noteworthy that Osborne et al. (2016) reported a greater sensitivity of soybean yield to O<sub>3</sub> dose (mean daily 7 hr concentrations) in O<sub>3</sub>-FACE compared to OTC experiments ( $p = .048$ ), which is opposite to our findings in this study. This apparent inconsistency could be attributed to differences in the datasets used. We limited ourselves to the use of published results only, and, hence, the yield data from the 2009 and 2010 O<sub>3</sub>-FACE experiments were represented by values averaged across the seven cultivars used (as published by Betzelberger et al., 2012). Osborne et al. (2016), however, used the original experimental data for the individual seven cultivars. This allowed them to analyze the varietal differences in O<sub>3</sub> sensitivity in detail, but also resulted in data from 2009 and 2010 (which had seven cultivars

and nine O<sub>3</sub> levels) dominating their analyses. We therefore argue that the apparent difference between the two studies may reflect the difference in their thrusts: varietal difference in O<sub>3</sub> sensitivity for Osborne et al. (2016) and OTC versus O<sub>3</sub>-FACE contrast in this study. As noted above, our OTC-FACE contrast has been strongly affected by the results of the dry year of 2007.

Our study also differed from that of Osborne et al. (2016) with respect to data selection criteria. Osborne et al. (2016) included all data on soybean and their analysis indeed indicated that the O<sub>3</sub> sensitivity may differ among regions (countries) of the experiments. To allow for a stricter OTC versus O<sub>3</sub>-FACE comparison, we therefore chose to include OTC data of a given species only if it came from the same region as the O<sub>3</sub>-FACE data of that species. Another difference between the present study and Osborne et al. (2016) is that we excluded all data from experiments with potted plants. However, Osborne et al. (2016) compared the O<sub>3</sub> sensitivity of plants grown in pots versus plants freely rooted in the field and found no significant differences.

For winter wheat, the stronger sensitivity in O<sub>3</sub>-FACE compared to OTC experiments is in line with earlier results on this species. Zhu et al. (2011) reported on a twofold higher O<sub>3</sub> sensitivity of grain yield in O<sub>3</sub>-FACE compared to OTC experiments, but their dataset and methodology did not allow them to conclude that the effect was statistically significant. Compared with Zhu et al. (2011), this study included more recent results, that is, the four cultivars from studies in 2010 and the one cultivar (J002) studied from 2007 to 2010. Furthermore, the statistical power of the method used in the present study is stronger than that used by Zhu et al. (2011), which relied on simple observation of whether or not 95% CIs were overlapping (a method which can be criticized, e.g., Schenker & Gentleman, 2001). The lower O<sub>3</sub> sensitivity in OTC compared to O<sub>3</sub>-FACE experiments could have been caused by higher temperature and VPD in OTCs reducing stomatal conductance and leaf O<sub>3</sub> uptake, as suggested by Piikki et al. (2008). Moreover, unlike for soybean, the wheat plants were not irrigated in either OTC or O<sub>3</sub>-FACE experiments, except in one OTC study contributing two data points (Tong et al., 2012). In the other OTC experiments, the chambers had roofs



**FIGURE 1** Ozone dose (AOT40)–relative yield (RY) relationships for (a) soybean, (b), wheat, and (c) rice. All slopes of the linear relationships are significantly different from zero

which were installed 30 cm above the top of the chamber walls. The roof diameter was greater than the opening at the top, and the rainfall was thus mostly excluded by the roof. Plants inside OTC got soil water from lateral flow from the soil surrounding the chambers as well as from the shallow ground water (<1 m), but soil moisture should have been lower in OTC than in O<sub>3</sub>-FACE experiments. This experimental artifact thus likely limited the stomatal O<sub>3</sub> uptake and contributed to the lower O<sub>3</sub> sensitivity in OTC compared to

O<sub>3</sub>-FACE experiments with wheat. In contrast to the situation for soybean, O<sub>3</sub> was released at the top of the canopy in both OTC and O<sub>3</sub>-FACE experiments with wheat and rice, leaving the VPD and soil moisture effects to dominate over that of possible vertical O<sub>3</sub> profiles within the canopy.

Cultivar differences may also have contributed to the difference in O<sub>3</sub> sensitivity for wheat, but this is very difficult to assess properly with the present dataset since most cultivars are different between the O<sub>3</sub>-FACE and OTC experiments. However, a comprehensive meta-analysis on wheat investigating this issue concluded that the large variation in O<sub>3</sub> sensitivity among experiments were related to neither year of experiment nor year of cultivar release (Pleijel, Broberg, Uddling, & Mills, 2018).

For rice, this is the first analysis to compare the difference in O<sub>3</sub> sensitivity between OTC and O<sub>3</sub>-FACE experiments. The higher O<sub>3</sub> sensitivity in O<sub>3</sub>-FACE compared to OTC experiments was likely linked to cultivar differences. A previous study reported that hybrid cultivars of rice showed higher stomatal conductance (Pang, Kobayashi, & Zhu, 2009) and greater yield responses to O<sub>3</sub> than inbred cultivars (Shi et al., 2009). In the present dataset, hybrid cultivars were used in O<sub>3</sub>-FACE experiments only. When excluding these from the analysis, the difference between OTC and O<sub>3</sub>-FACE experiments was no longer statistically significant ( $p = .457$ , Table S2). This suggests that the apparent difference in O<sub>3</sub> sensitivity between OTC and O<sub>3</sub>-FACE for rice could be attributed to the difference in sensitivity between hybrid and inbred cultivars. Since rice plants in both OTC and O<sub>3</sub>-FACE were grown in flooded soil, it is unlikely that soil water availability limited stomatal O<sub>3</sub> uptake in either of the exposure systems. Furthermore, the passive OTC warming artifact likely had a smaller effect on VPD in rice experiment than those with upland crops. Since rice plants in both OTC and O<sub>3</sub>-FACE were grown in flooded soil, the temperature increase in OTC caused increased evaporation from the flooded water surface, with actual vapor pressure increasing along with the increase in saturated vapor pressure due to the temperature rise.

## 4 | CONCLUSION

This study has demonstrated that three major crops showed apparent differences in O<sub>3</sub> sensitivity between OTC and O<sub>3</sub>-FACE experiments. In wheat and rice, O<sub>3</sub> sensitivity was higher in O<sub>3</sub>-FACE compared to OTC experiments, while the opposite was the case for soybean. These differences could be linked to two factors: differences in environmental artifacts and differences in O<sub>3</sub> sensitivity of the cultivars used in OTC and O<sub>3</sub>-FACE experiments. In soybean, irrigation likely increased the sensitivity to O<sub>3</sub> in OTC experiments, whereas in wheat OTC experiments, removal of rainfall inputs by partial roofs together with increased temperature and VPD likely decreased stomatal O<sub>3</sub> uptake and impacts. In rice, the higher sensitivity in O<sub>3</sub>-FACE experiments was linked to the inclusion of hybrid cultivars with higher stomatal conductance and O<sub>3</sub> sensitivity than inbred cultivars (Pang et al., 2009), and the sensitivity difference

between OTC and O<sub>3</sub>-FACE experiments disappeared when only inbred cultivars were considered. These differences in O<sub>3</sub> sensitivity between OTC and O<sub>3</sub>-FACE experiments could to a large extent have been accounted for using a stomatal flux-based O<sub>3</sub> dose metric, instead of AOT40 which only considers O<sub>3</sub> concentrations in the air. This study thus demonstrates that accounting for factors that control stomatal conductance is important when applying experimental data to assess O<sub>3</sub> impacts on crops at large spatial scales, supporting the use of a stomatal flux-based O<sub>3</sub> index for improved regional and global O<sub>3</sub> impact assessments on crops.

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