

Global synthesis of air-sea CO₂ transfer velocity estimates from ship-based eddy covariance measurements

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A short history of gas exchange studies

1973 *Liss*

Two layer model
flux = $K \Delta C$

1986 *Liss & Merlivat*

Different K v. U slopes
and Sc exponents in
different regimes

1986 *Broecker et al.*

Eddy covariance (EC) with
open path IR give CO₂ flux an
order of magnitude too large

1987 *Jaehne et al.*

Small scale waves matter:
 $K \propto u_* Sc^n$, n from -2/3 to
-1/2

1992 *Wanninkhof*

Global ¹⁴C disequilibrium
 K_{CO_2} assumed to $\propto U^2$

1997 *Wolff*

Bubble-mediated gas exchange
more important for less soluble
gas

1999 *Wanninkhof &
McGillis*

EC (closed-path IR, not
dried) $K_{CO_2} \propto U^3$

2000 *Nightingale et al.*

Dual tracer ³He/SF₆
Quadratic relationship between K
and U ; $n \cong -1/2$

A short history
of gas
exchange
studies
(continued)

2003 Zhao & Toba.

Parametrize K with wave
Reynolds number

2004 Frew *et al.*

Active thermography:
Small waves a better proxy of
 K than U as they account for
surfactants

2004 Huebert *et al.*

EC K_{DMS} vs. U power ~ 1
 $K > 0$ at low U

2010 Miller *et al.*

EC CO_2 flux measurements
markedly improved by using
closed path, dried IR analyzer

2014 Landwehr/Blomquist *et al.*

Confirm benefits of drying the air
in EC CO_2 flux measurements

2016 Butterworth & Miller

First autonomous EC CO_2 flux
measurements on ship

2017 Bell/Blomquist *et al.*

$K_{CO_2} > K_{DMS}$ at high U due to
bubbles

2021 Yang *et al.*

Strong evidence that natural
surfactants modulate K_{CO_2} over
open ocean

This work

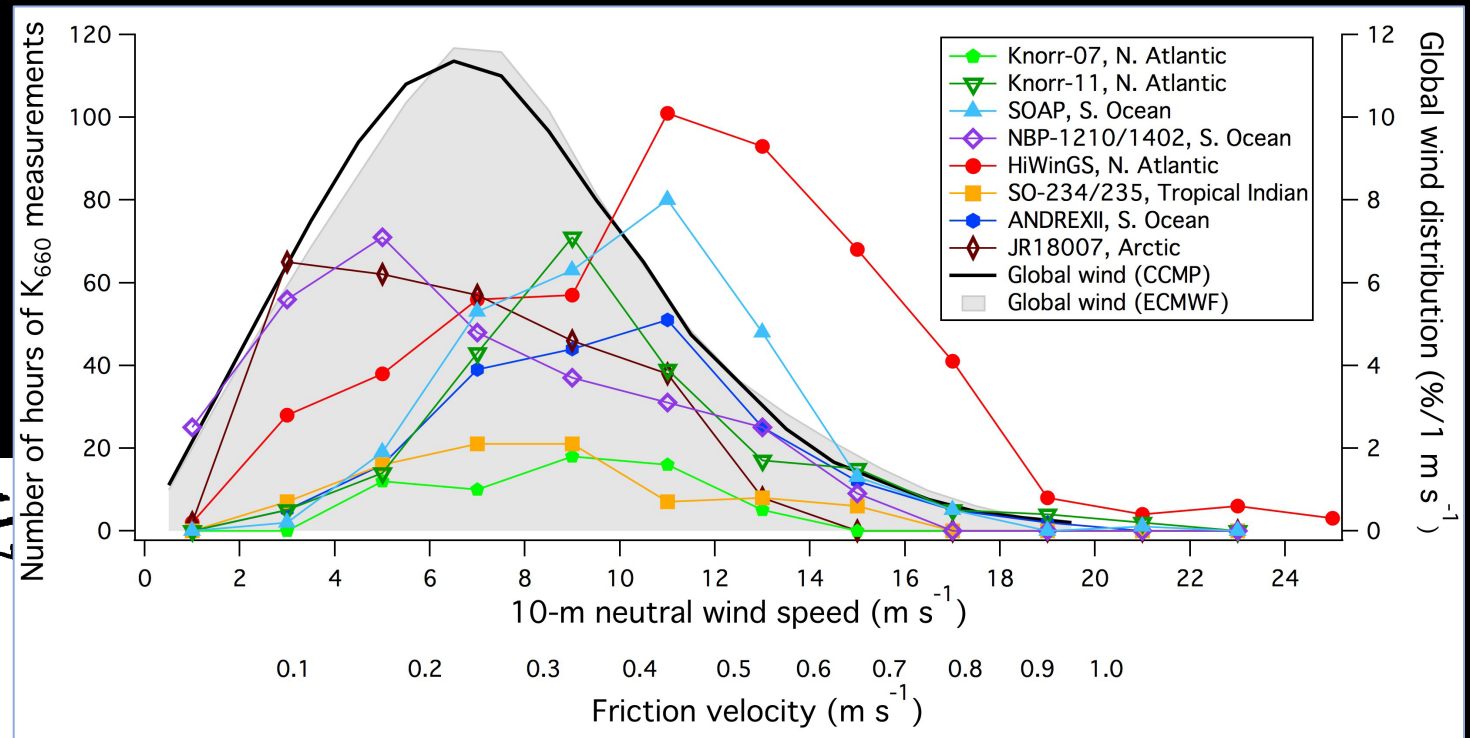
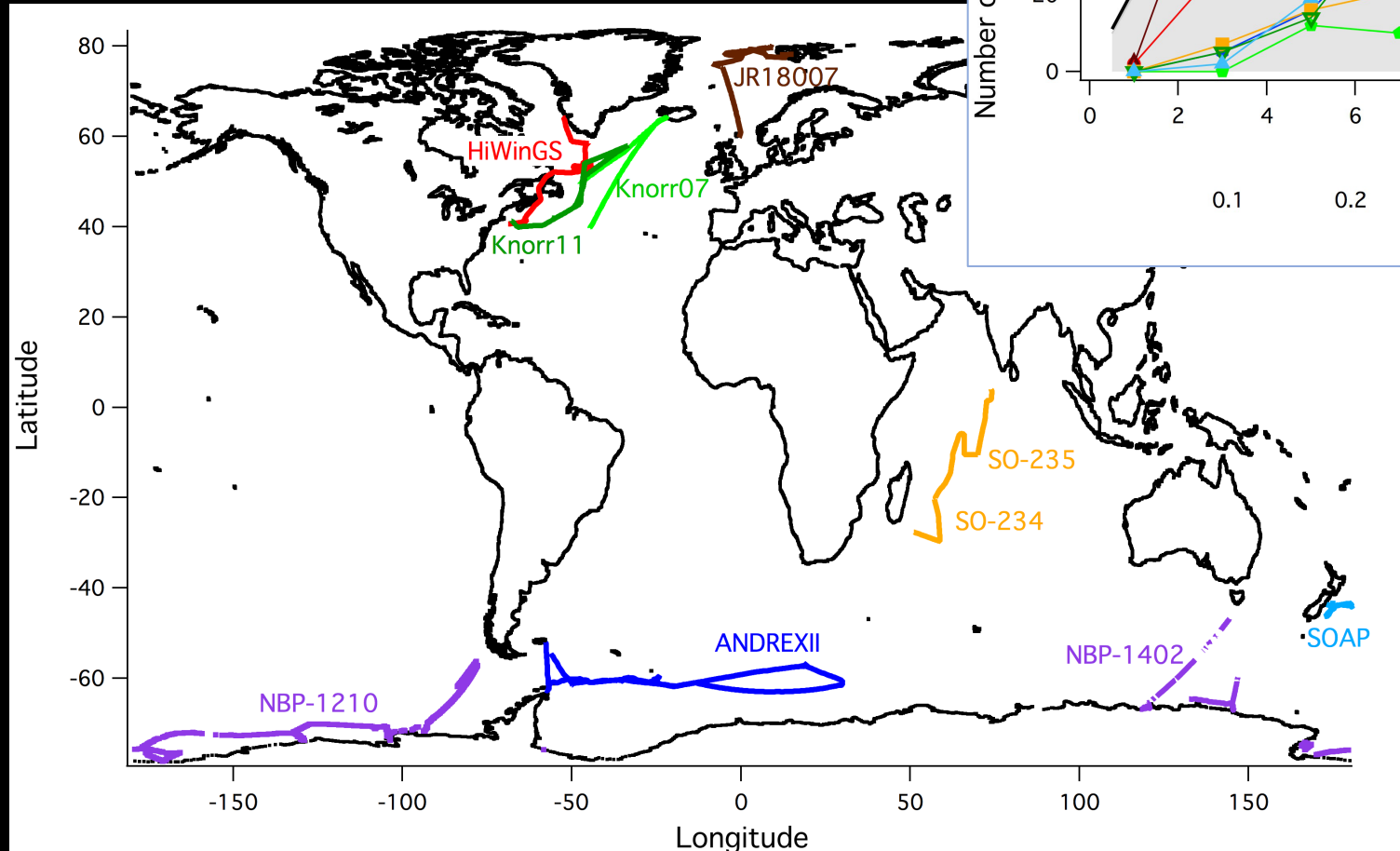


- Synthesis of the state-of-the-art shipboard CO₂ gas transfer velocity (K_{CO_2}) measurements since 2007
 - Consistent flux averaging time interval (hourly)
 - Updated solubility and Schmidt number parametrization (Wanninkhof 2014)
 - Inclusion of cool skin effect on ΔC (Woolf et al. 2016)
- Assessment of measurement uncertainty
- Physical processes
 - Moderate wind
 - Low wind
 - Large and small waves
- Conclusion and outlook

Datasets

11 cruises from the last decade+
All used closed-path, dried CO₂
Analyzer (2000 h of data)

$$K_{660,CO_2} = \text{flux} / \Delta C (660/S_c)^{-0.5}$$



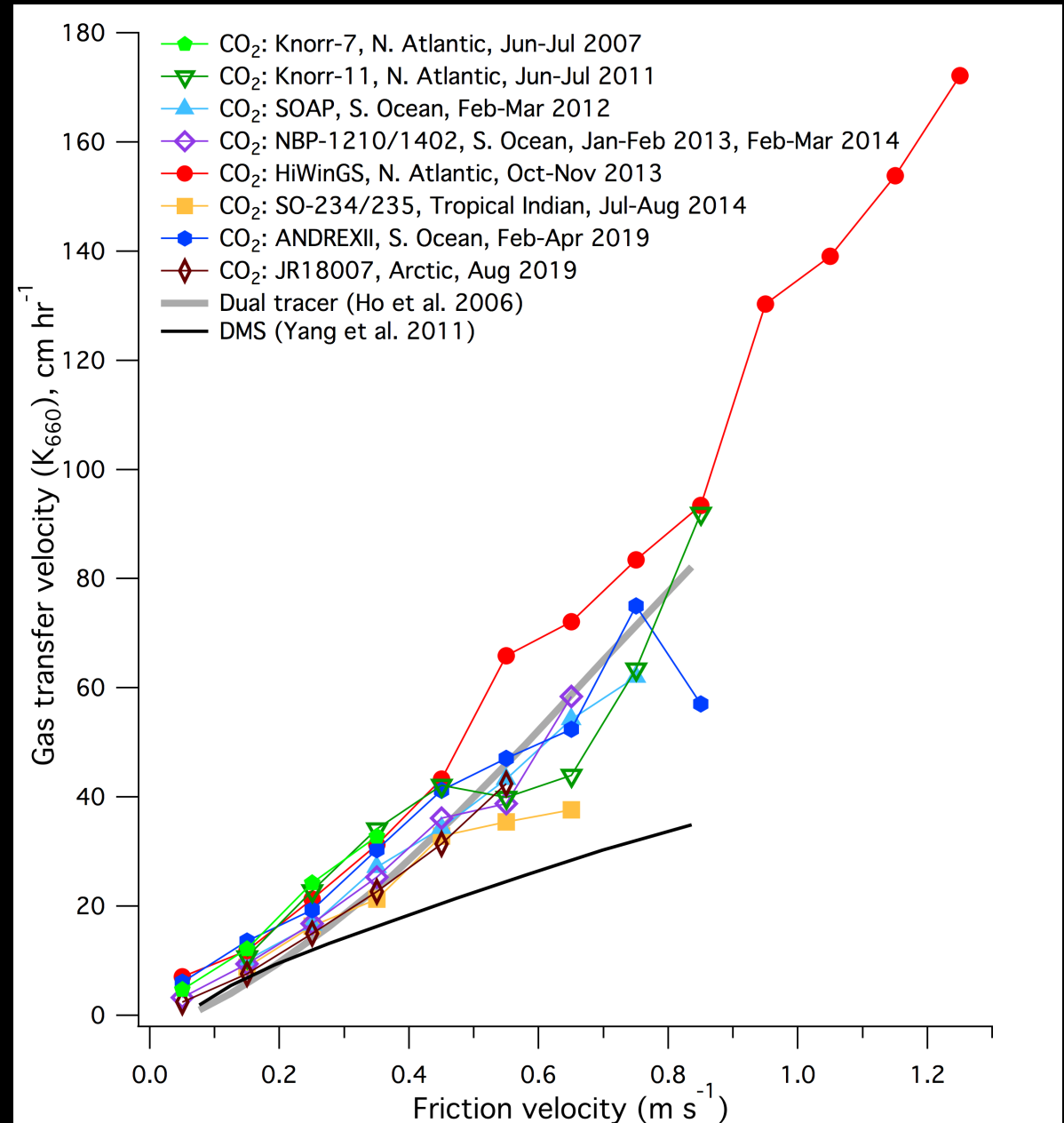
Most data at moderate wind speeds

Measurements in very low/high winds still limited (but >> other methods)

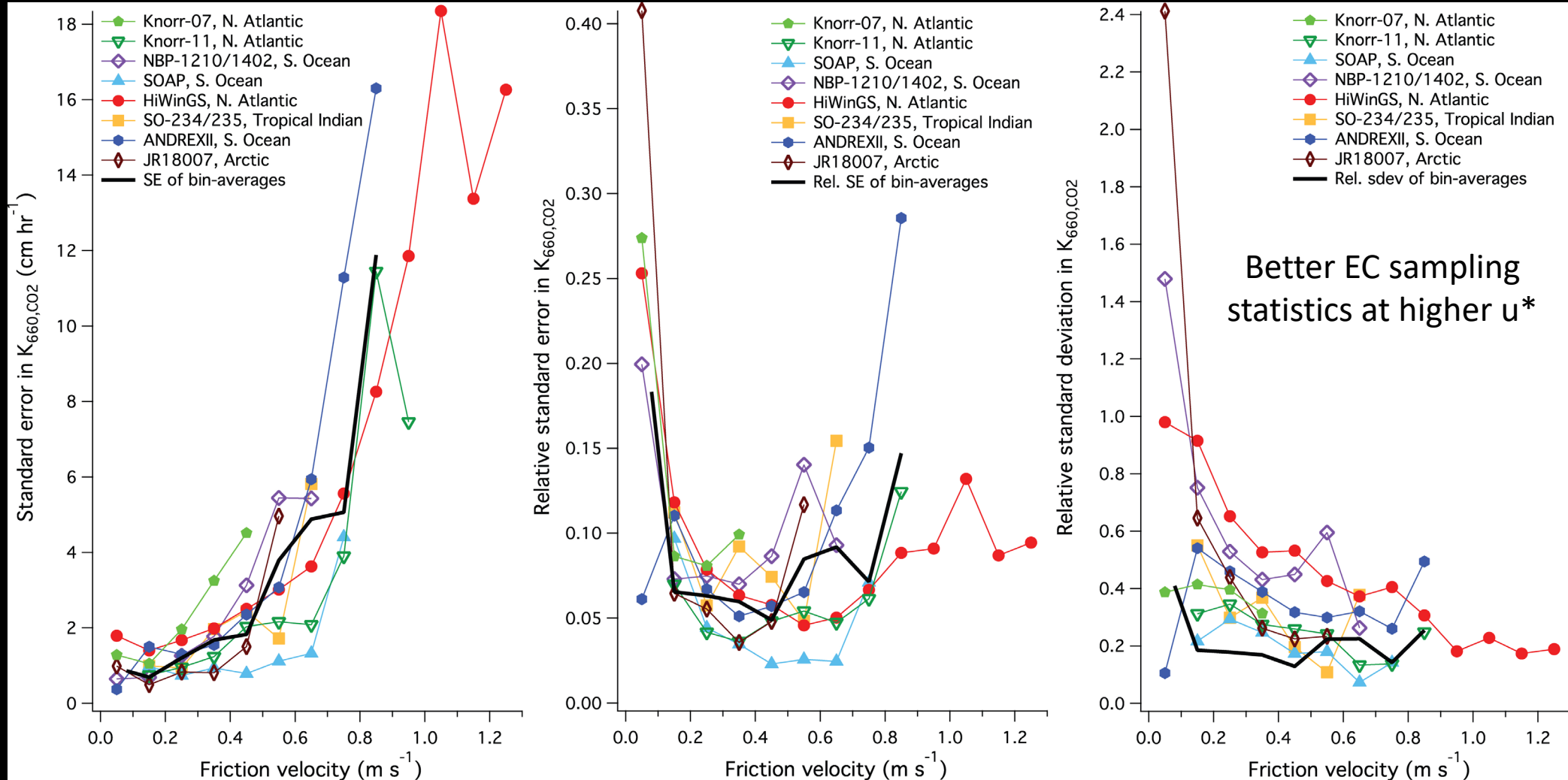
Results

- K_{660,CO_2} vs. friction velocity (u_*)

- Approximately **linear** relationship between K_{660,CO_2} and u_* (between u_* of 0.1 and 0.5 $m s^{-1}$)
- At given u_* , K_{660,CO_2} tends to be higher in N. Atlantic/Southern Ocean than in Arctic/tropics
- What causes regional variation in K_{660,CO_2} among different cruises?



Variability and representativeness of sampling

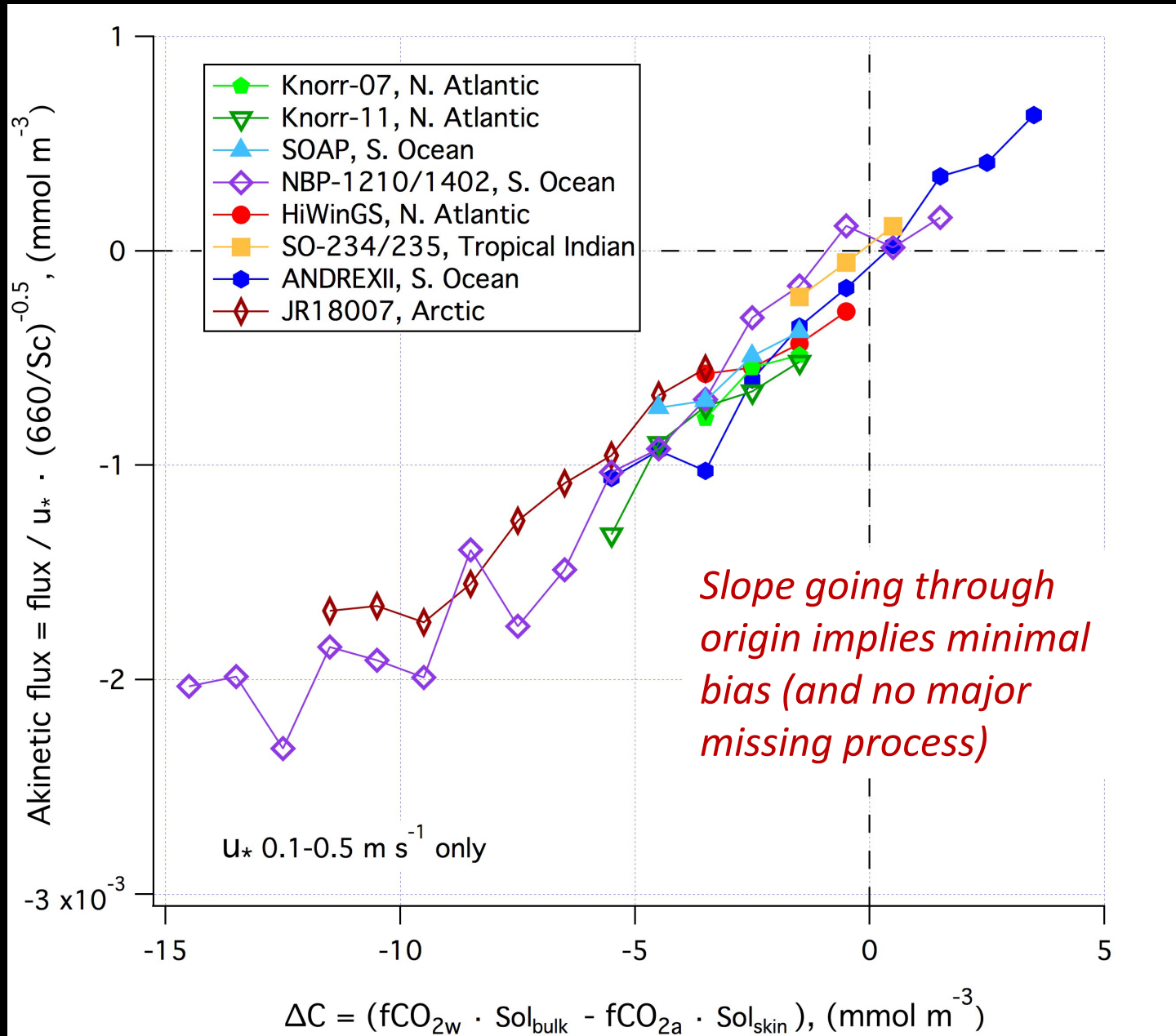


Better EC sampling statistics at higher u_*

Standard error (SE) within u_* bins increase with u_*

Rel. SE (SE / K_{660bin}) highest at low/high u_* due to limited sampling

Rel. sdev ($sdev / K_{660bin}$) decreases with u_*



Assessment of uncertainty - 'Akinetic flux'

$$K_{660} = \text{flux} / \Delta C (660/Sc)^{-0.5}$$

- Bias in well-processed EC flux should be small (<10%; Dong et al. 2021)
- Bias in ΔC generally thought to be <10% at sufficient $|\Delta C|$
- *Low $|\Delta C|$ data usually discarded in K_{660} calculation, a waste!*

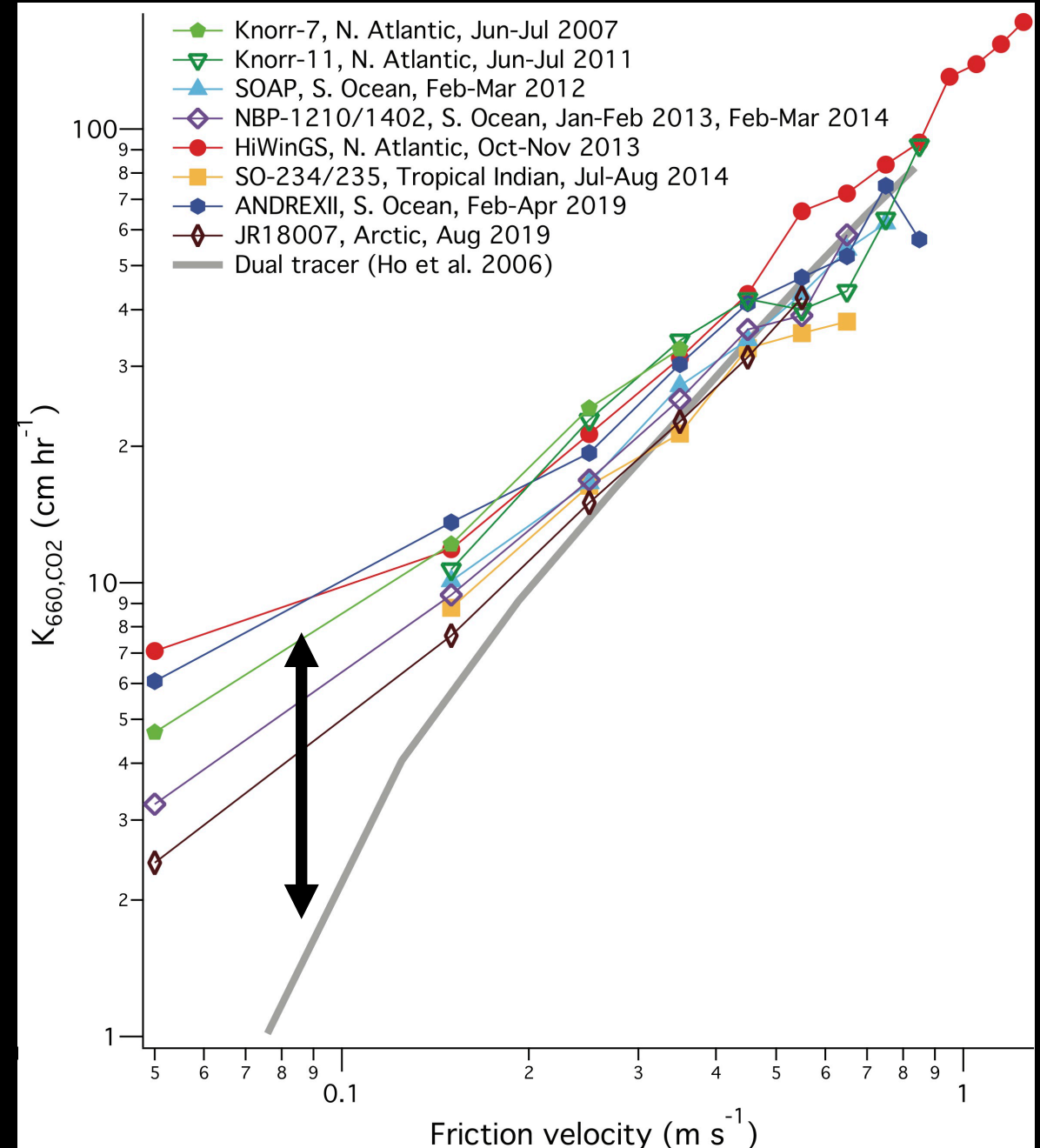
$$\begin{aligned} \text{Akinetic flux} &= \text{flux} (660/Sc)^{-0.5} / u_* \\ &= \Delta C K_{660} / u_* \end{aligned}$$

where the slope is \sim transfer coefficient (K_{660}/u_*)

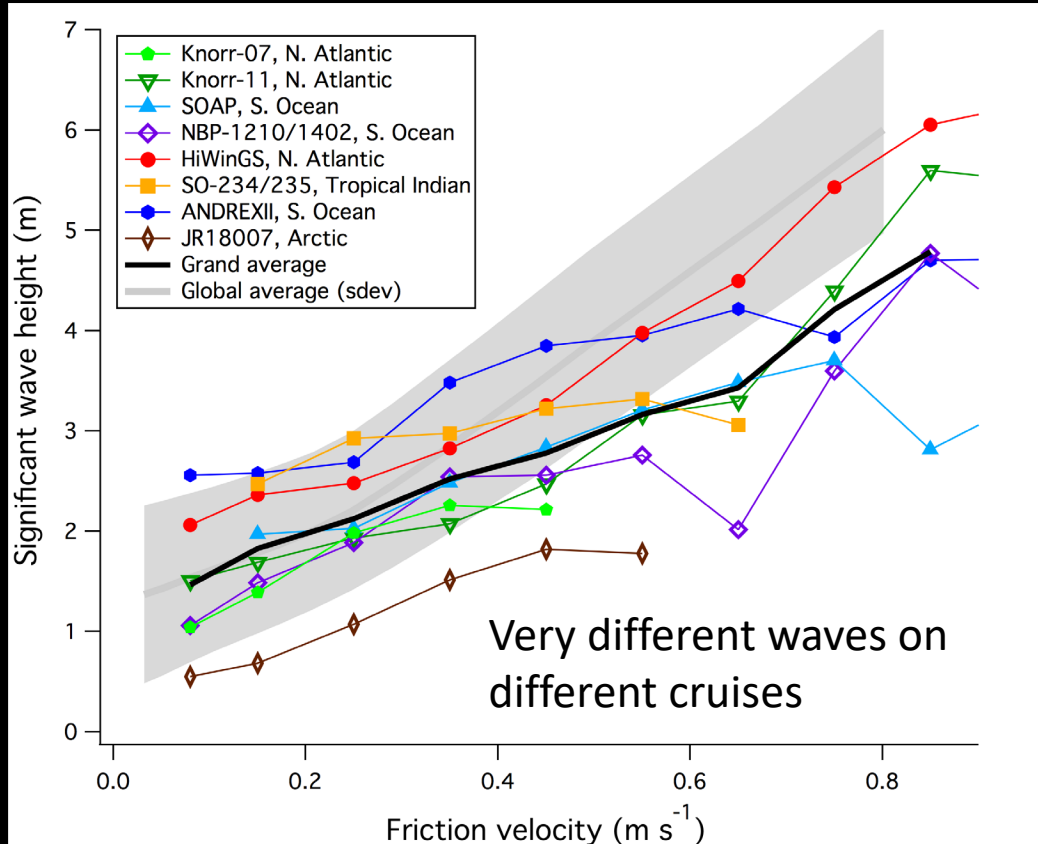
Low wind speed regime

$K_{660,CO_2} > K_{660,dualtracer}$ at low u_* by ~ 4 cm hr^{-1} , possibly because of

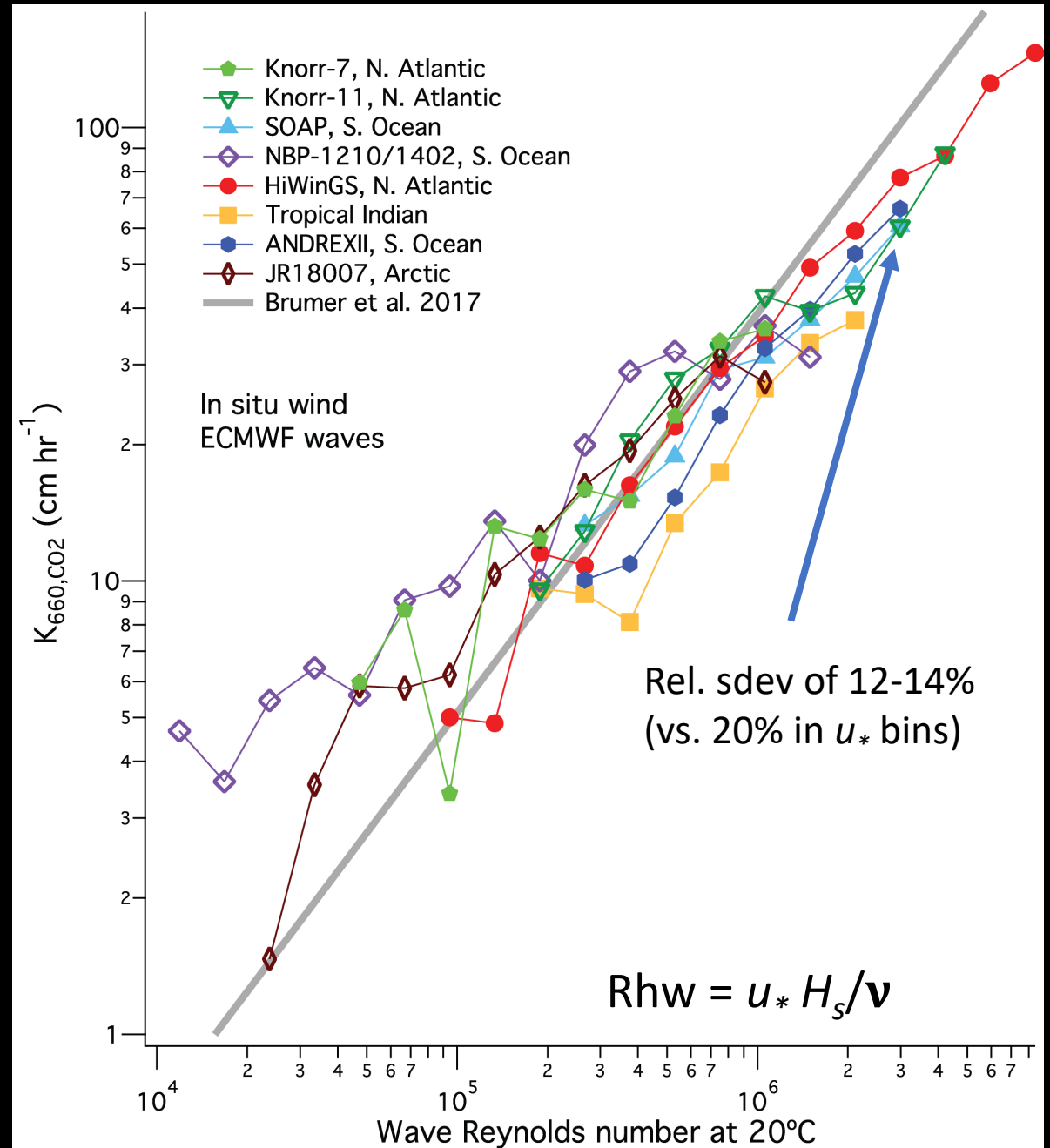
- Chemical enhancement in CO_2 (ca. 1-2 cm hr^{-1} , Wanninkhof 1992)
- Assumption of $K = 0$ in dual tracer fit, when convective driven turbulence may result in ca. 1-2 cm hr^{-1} at $U=0$ (COARE model)
- Uncertainty in Schmidt number exponent as $f(U, \text{surfactants, e.g. Esters et al 2017})$



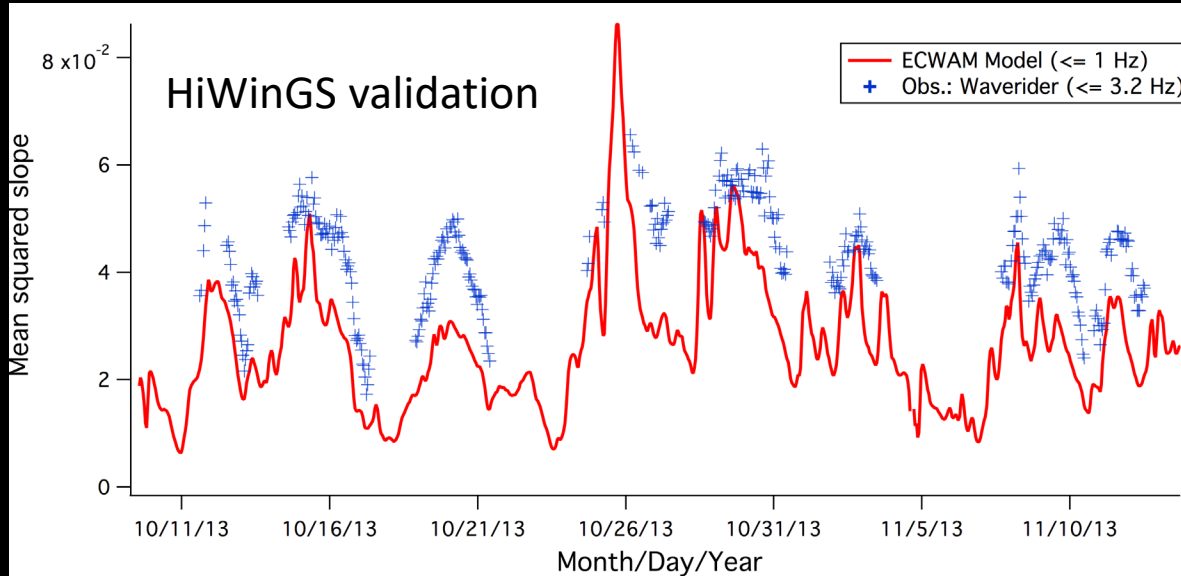
High wind speed regime



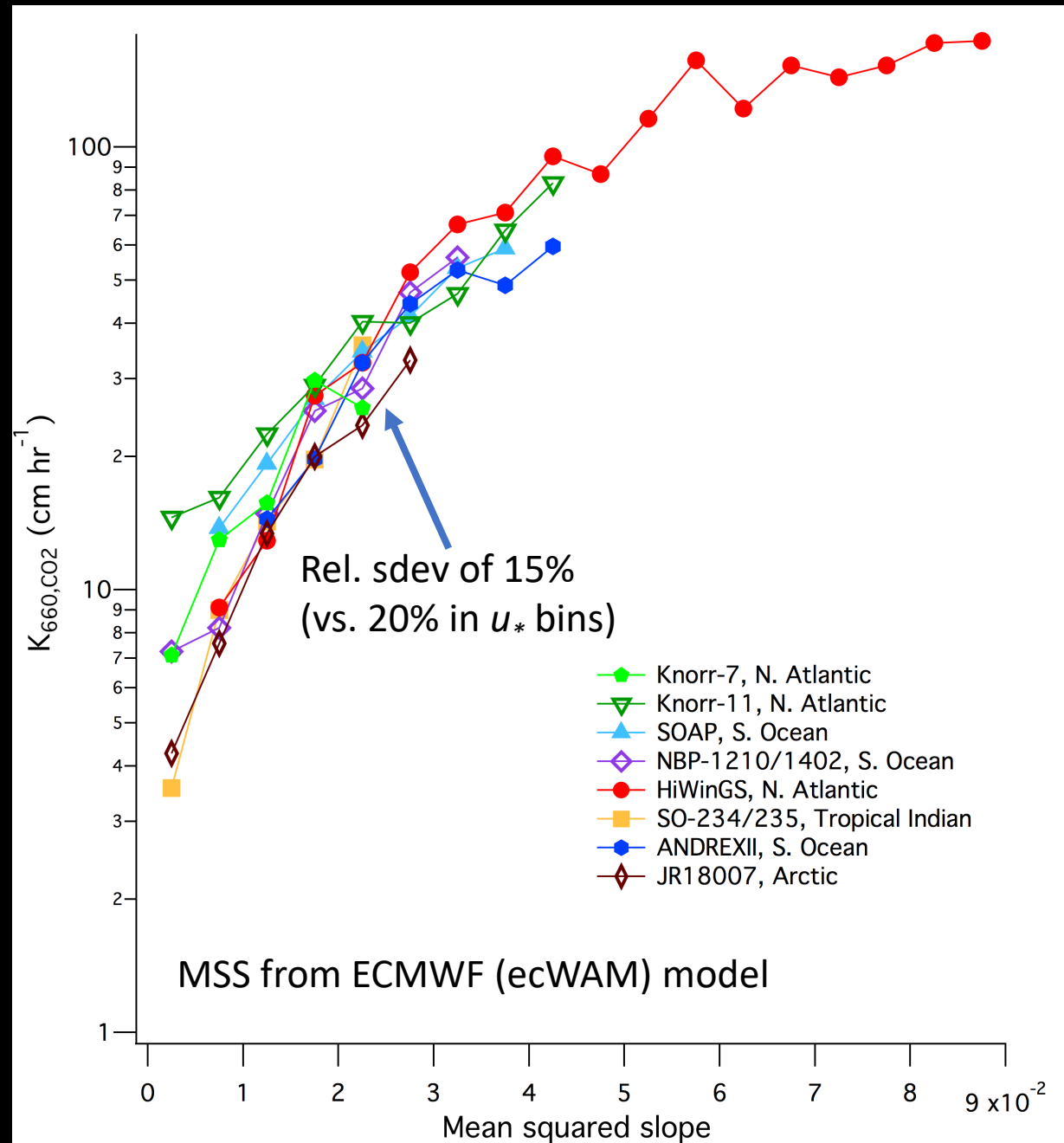
Wave Reynolds number helps to collapse some of the scatter and regional variability at high wind speeds

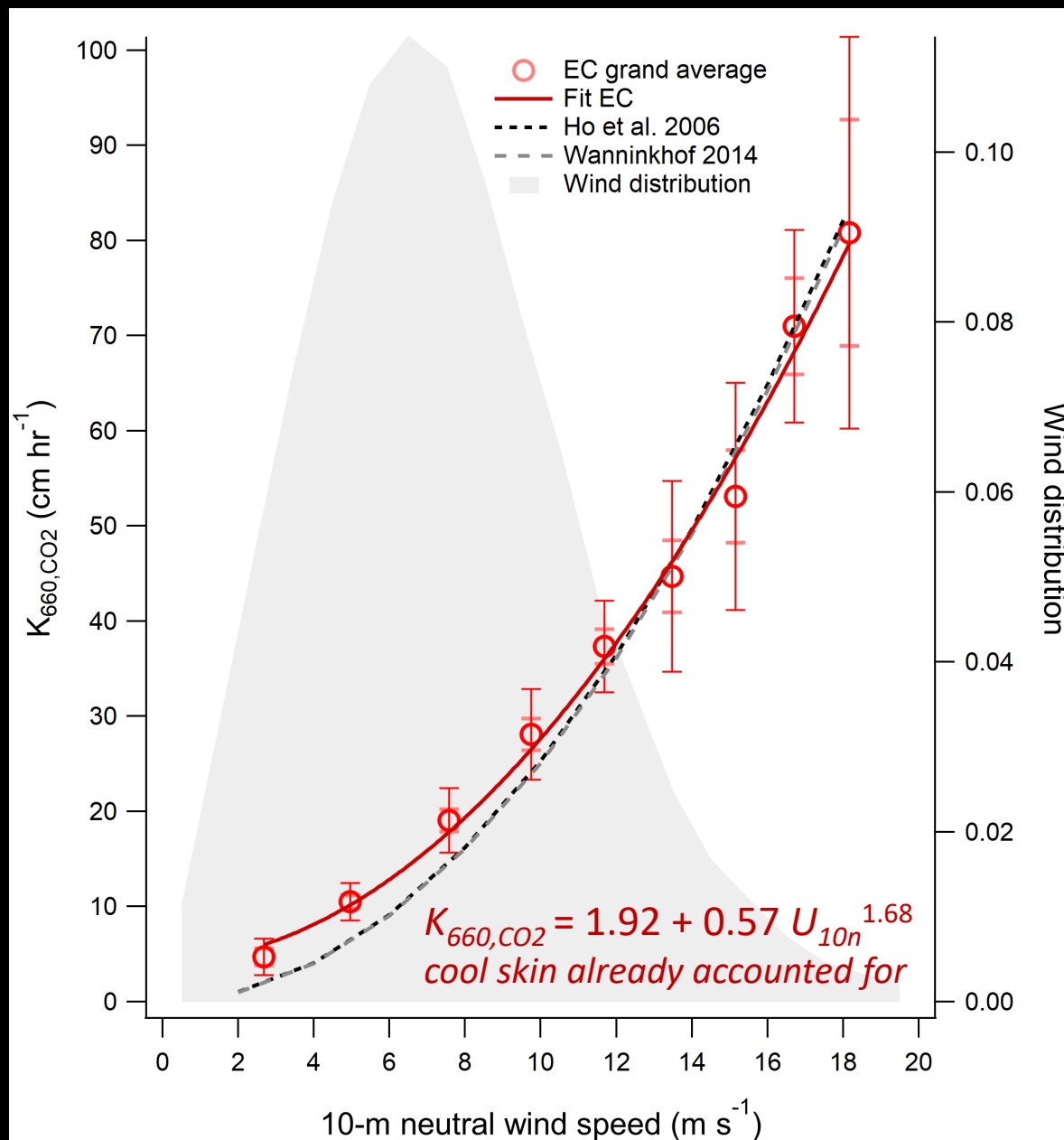


Importance of small waves - Mean squared slope



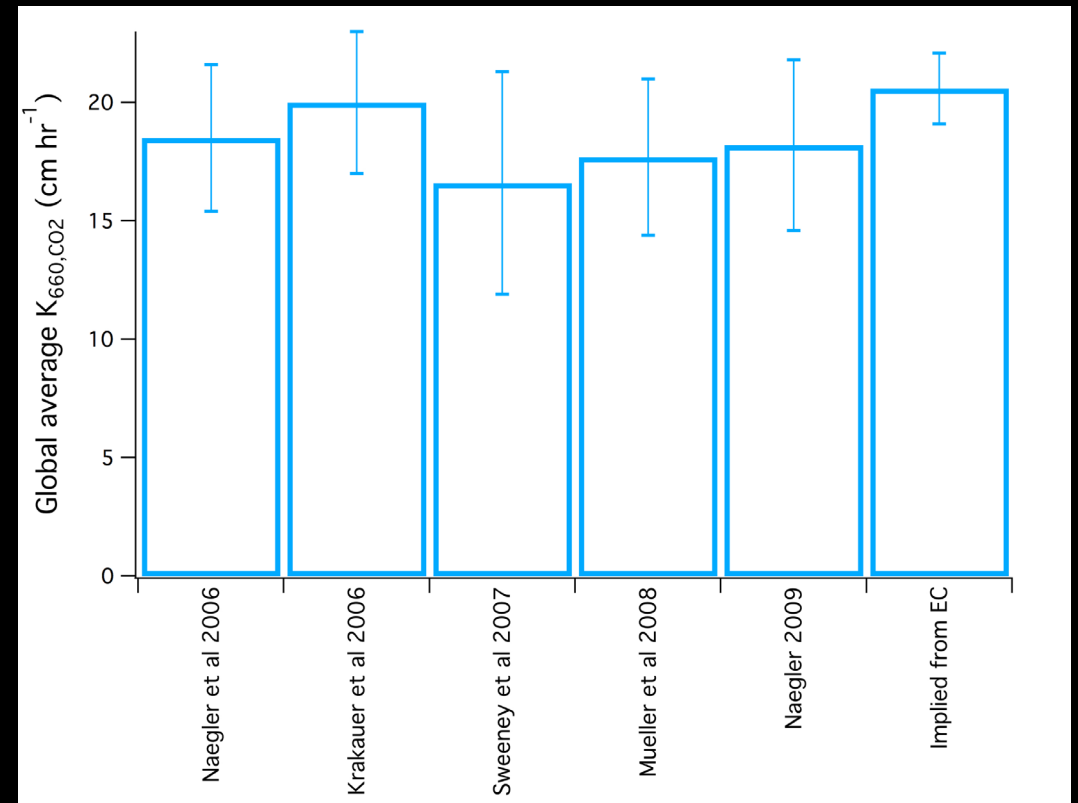
Mean squared slope of small waves helps to collapse some of the scatter at low to moderate wind speeds
(consistent with Frew et al. 2004)





Yang et al. *Frontiers*, in review

Grand average of EC K_{660,CO_2} x global wind distribution gives a global mean K_{660,CO_2} of $\sim 20 \text{ cm hr}^{-1}$
 - in agreement with latest ^{14}C -based estimates
 - $\sim 20\%$ higher than implied by dual tracer



Naegler 2009

Key take home messages

from first synthesis of K_{660,CO_2} from EC flux measurements

What we know:

- Uncertainty/variability
 - Rsdev (RSE) 20% (7%)
 - Absolute uncertainty in K_{660,CO_2} is large while relative uncertainty is small
- U dependence & magnitude
 - K_{660,CO_2} scales \sim linearly with U in high winds and $\langle U^2 \rangle$ over moderate winds
 - $K_{660,CO_2} \gg 0$ in low wind
 - $\langle K_{660,CO_2} \rangle$ consistent with U^2 in low wind
- Waves matter
 - Wave Reynolds number and mean squared slope help to collapse variability in K_{660,CO_2} in high and moderate winds, respectively

What remains unclear:

- See **Yang et al.** poster on bubbles
 - Surfactants and bubbles towards K_{660,CO_2} (dominant (COARE model) to *Yang et al. 2018* & *Melville 2018*) to *Yang et al. 2019*)
- See **Dong et al.** posters on
 - EC flux uncertainty
 - Southern Ocean EC CO_2 flux and K_{660,CO_2} (*Dong et al. 2019*) shows that surfactants reduce K_{660,CO_2} by 30% at U of 7 m s^{-1}
- See **Bell et al.** talk on
 - Parametrization of K with scattering angle as a better descriptor of K_{660,CO_2} ? (small U)
 - waves/surfactants/bubbles all in one go, with satellite scalability?

CRUISE ID	TIME	SHIP	REGION	CO ₂ ANALYZER	N > 20 (30) μ ATM	MEAN SST	ORIGINAL REFERENCE
Knorr-07(a/b)	Jun-Jul 2007	<i>Knorr</i>	North Atlantic	Modified LI-COR Li-7500	61 (61)	13	Miller et al. 2009
Knorr-11	Jun-Jul 2011	<i>Knorr</i>	North Atlantic	Modified LI-COR Li-7500	215 (215)	10	Bell et al. 2017
SOAP	Feb-Mar 2012	<i>Tangaroa</i>	Southern Ocean (temperate)	Modified LI-COR Li-7500	220 (220)	15	Landwehr et al. 2018
NBP-1210/1402	Jan-Feb 2013; Feb-Mar 2014	<i>Palmer</i>	Southern Ocean (polar)	LI-COR Li-7200	302 (302)	0	Butterworth & Miller 2016
HiWinGS	Oct-Nov 2013	<i>Knorr</i>	North Atlantic	Picarro G1301-f (LI-COR Li-7200)	530 (467)	10	Blomquist et al. 2017
SO-234/235	Jul-Aug 2014	<i>Sonne</i>	Tropical Indian	LI-COR Li-7200	86 (44)	25	Zavarsky et al. 2018
ANDREXII	Feb-Apr 2019	<i>James Clark Ross</i>	Southern Ocean (subpolar)	Picarro G2311-f	289 (199)	1	Yang et al. 2021
JR18007	Aug 2019	<i>James Clark Ross</i>	Arctic	Picarro G2311-f	278 (278)	6	Dong et al. 2021

Cruise ID	K_{660} fit to u^* (bin-averages)	K_{660} fit to u^* (hourly data)	r^2 of hourly fit	Min/median/max in ΔfCO_2	In-situ U_{10n} vs. ECMWF U_{10n}
Knorr-07(a/b)	$-2.7 + 103.1u^*$	$-0.2 + 91.1u^*$	0.48	-122/-51/-36	$0.46 + 0.97 U_{10n_ECMWF}$
Knorr-11	$-4.3 + 105.8u^*$	$-5.7 + 112.2u^*$	0.58	-110/-50/-35	$0.96 + 0.96 U_{10n_ECMWF}$
SOAP	$-2.9 + 83.2u^*$	$-7.7 + 96.2u^*$	0.72	-130/-54/-36	$1.91 + 0.88 U_{10n_ECMWF}$
NBP-1210/1402	$-4.7 + 88.8u^*$	$-3.2 + 85.3u^*$	0.51	-250/-55/24	$0.43 + 0.99 U_{10n_ECMWF}$
HiWinGS	$-2.7 + 94.6u^*$ ($-4.4 + 104.3u^*$)	$-4.3 + 99.8u^*$ ($-6.8 + 111.9u^*$)	0.40 (0.37)	-63/-41/-11	$0.33 + 0.96 U_{10n_ECMWF}$
SO-234/235	$-0.3 + 58.2u^*$ ($-3.3 + 77.1u^*$)	$-2.0 + 66.9u^*$ ($-1.9 + 72.0u^*$)	0.54 (0.67)	-49/9/40	$-0.45 + 1.13 U_{10n_ECMWF}$
ANDREXII	$-2.0 + 94.0u^*$	$-4.8 + 100.0u^*$	0.46	-87/-12/76	$0.16 + 1.01 U_{10n_ECMWF}$
JR18007	$-4.5 + 79.0u^*$	$-3.8 + 78.1u^*$	0.72	-183/-122/-64	$0.50 + 0.97 U_{10n_ECMWF}$

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Web of Science, Apr 2022

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