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Supplementary Material

2 **Supplementary Analysis: Models S1**

3 For comparability with the 200 s long fNIRS measurements during metronomic breathing, the main
4 analyses included also only the first 200 s of the 15 min resting state measurements. To assure the
5 time-invariance of the resting-state connectivity (across the overall 15 min measurement) we
6 performed a control analysis of four consecutive, 200 s long segments of the resting state data and
7 fitted a linear mixed model with the fixed effects structure comprising the 3-way interaction between
8 *direction*, *time window* and *hemisphere* (including all main effects and lower-order interactions,
9 Supplementary Table S3). Identical to all other mixed models in the present study, the random effects
10 were specified with a random slope allowing for varying effects of *direction* for each pair of
11 homologues connections and a random intercept for *participant* (Supplementary Table S2). The model
12 yielded two significant effects: a main effect for *direction* ($F(1,12) = 12.9, p = .004$) and an interaction
13 between *direction* and *hemisphere* ($F(1,2460) = 4.9, p = .027$). Predicted marginal means and statistics
14 for all fixed effects are provided in Supplementary Table S1 and S3, respectively. As the factor *time*
15 *window* did not exert any significant main or interaction effect, the present results hence do not depend
16 on the chosen segment of the resting state measurements.

17 **Supplementary Analysis: Models S2-S5**

18 FNIRS measurements are prone to motion-induced artifacts that can bias estimates of functional
19 connectivity and applying an appropriate correction method is strongly advised (Satterthwaite et al.
20 2012; Santosa et al. 2017). However, the correlation based signal improvement (CBSI) method, used
21 in the present analyses to remove motion artifacts, is based on assumptions that are not always met
22 (Cui et al. 2010) and to the best of our knowledge, a systematic investigation of the impact of the
23 CBSI method on Granger causality inference has not been published yet. We therefore complemented
24 the main analyses in Model 1 (DC estimates without covariate) and Model 2 (PDC estimates including
25 aBP as a covariate) by estimating DC and PDC from the uncorrected data of deoxygenated (Models S2

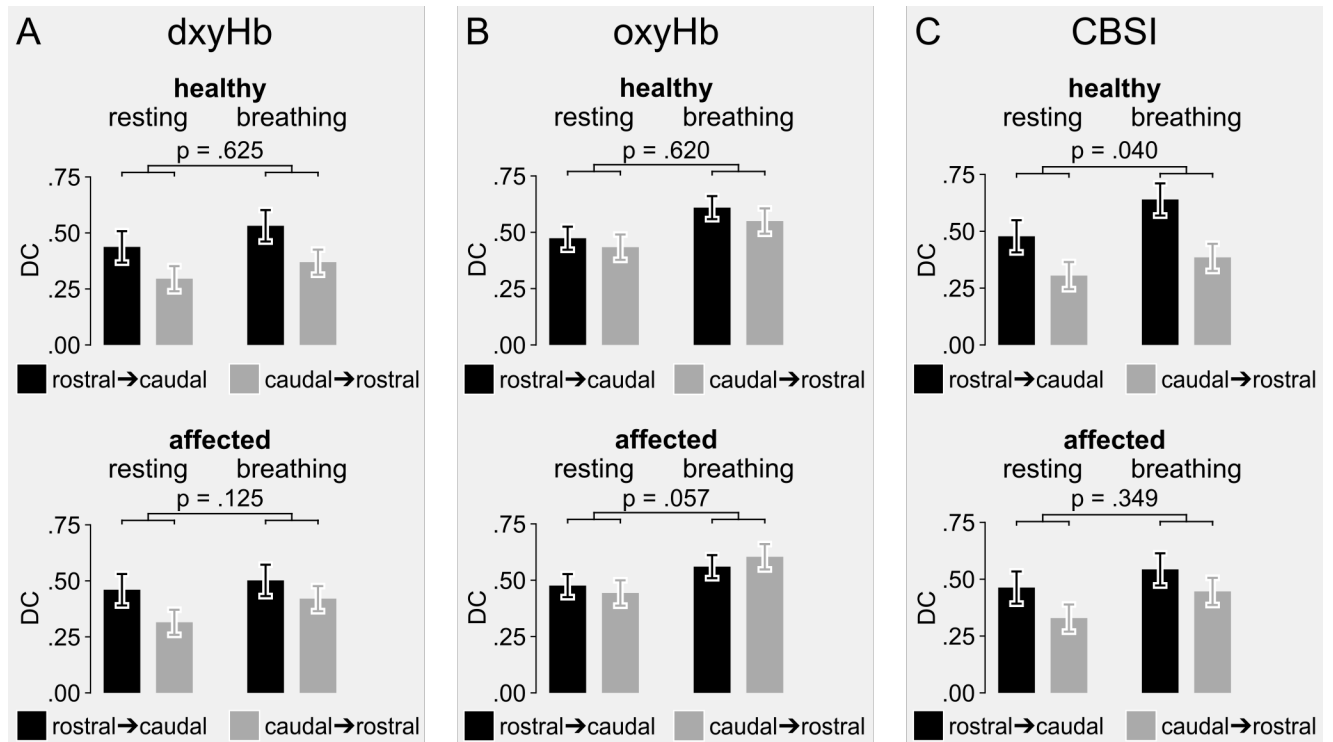
26 [DC] and S4 [PDC]) and oxygenated (Models S3 [DC] and S5 [PDC]) hemoglobin concentration
27 changes. Estimates for significant effects and statistics for random and fixed effects are summarized in
28 Supplementary Table S1, S2 and S3, respectively. Bar graphs in Supplementary Figure S1 (Model S2
29 and S3) and Figure S2 (Model S4 and S5) show the connectivity estimates analogue to Figure 3
30 (Model 1) and Figure 4 (Model 2) in the main text, respectively.

31 Supplementary Model S2 analyzed the DC estimated from the deoxygenated hemoglobin (dxyHb)
32 data and yielded a significant main effect for *direction* ($F(1,12) = 11.1, p = .006$) and for *condition*
33 ($F(1,1223) = 28.6, p < .0001$). Model S3 analyzed the oxygenated hemoglobin (oxyHb) data and
34 yielded a main effect for *condition* ($F(1,1212) = 76.0, p < .0001$) only. Neither the interaction between
35 *direction* and *hemisphere*, nor the interaction between *direction*, *condition* and *hemisphere* (that were
36 significant in Model 1 using the CBSI data) were significant for the data not corrected for motion
37 artifacts. However, the overall pattern of connectivity estimated from the dxyHb data was highly
38 similar to those estimated from the CBSI data (Figure S1), while the pattern for the oxyHb data
39 revealed an obvious deviation when compared to the CBSI data. Importantly, this deviation was
40 markedly reduced for the PDC estimates that were corrected for influences by systemic aBP
41 fluctuations, for both the dxyHb and the oxyHb data: Supplementary Model S4 analyzed the PDC
42 (corrected for aBP influences) estimated from the dxyHb data and revealed a significant main effect
43 for *direction* ($F(1,12) = 11.6, p = .005$); Model S5 analyzed the PDC estimated from the oxyHb data
44 and revealed a significant main effect for *direction* ($F(1,12) = 13.7, p = .003$) and for the interaction
45 between *direction* and *hemisphere* ($F(1,1212) = 8.4, p = .004$). Thus, similar to the main analyses of
46 the CBSI data, correcting the connectivity for influences by aBP fluctuations removed the effects of
47 *condition* in the dxyHb and the oxyHb data; at the same time the difference between healthy and
48 affected hemispheres resembled the results from the CBSI data.

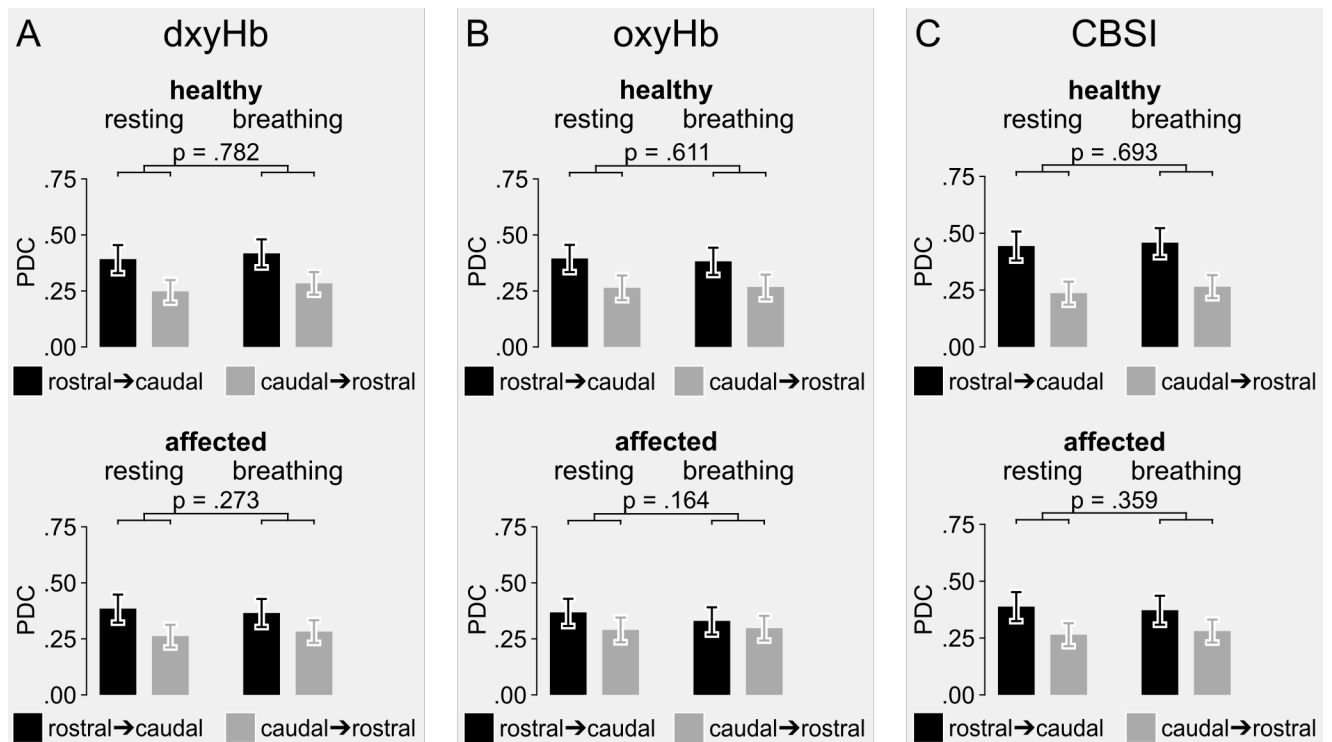
49 The deviating pattern in the DC values estimated from the oxyHb data is most likely due to the fact
50 that the oxyHb signal contains more physiological noise than the dxyHb signal (Obrig et al. 2000;
51 Zhang et al. 2009; Kirilina et al. 2012; Sutoko et al. 2019) and the observation that correcting for aBP
52 influences brought the results from the dxyHb, oxyHb and the CBSI data into line, corroborates our

53 finding that aBP-PDC effectively controls for bias of the functional connectivity estimate induced by
 54 physiological noise.

55 **Supplementary Figure S1**



56 Supplementary Figure S1: Comparison of DC estimates without applying an artifact correction to the DC derived
 57 from the data preprocessed using the correlation based signal improvement (CBSI). The connectivity estimated
 58 from the deoxygenated hemoglobin signal (A; Model S2) was similar to the connectivity estimated from the
 59 artifact corrected signal (C; Model 1), while the pattern of DC estimates derived from the oxygenated
 60 hemoglobin data (B; Model S3) markedly deviated from those derived from the CBSI data.

61 **Supplementary Figure S2**

62 Supplementary Figure S2: Comparison of PDC estimates corrected for aBP fluctuations with and without
 63 applying artifact correction (CBSI) during preprocessing. The pattern of PDC estimates were similar for the
 64 deoxygenated (A; Model S4), oxygenated (B; Model S5) and CBSI (C, Model 2) data suggesting that the
 65 deviating results for the oxyHb-derived DC estimates were due to the higher susceptibility of the oxyHb
 66 measurement to physiological noise (Obrig et al. 2000; Zhang et al. 2009; Kirilina et al. 2012; Sutoko et al.
 67 2019) and corroborating our finding, that including the aBP signal in PDC estimation effectively controlled for
 68 bias induced by physiological noise.

69 **Supplementary Analysis: Model S6**

70 In order to explicitly test the effect of correcting the DC connectivity estimates by including the aBP
 71 time series in the VAR model, we tested the factors *direction*, *condition*, and *VAR model type* (with
 72 and without aBP-correction) and all resulting two- and three-way interactions as fixed effects terms in
 73 a linear mixed model (Model S6; with the same random effects structure as in Model 1 and 2; see
 74 Supplementary Table S3 for an overview of all fixed effects). This model considered only the healthy
 75 hemisphere, because the difference between conditions (resting state vs. breathing) in the uncorrected
 76 data was not present in the affected hemisphere. While there was a marked difference between
 77 conditions in the uncorrected data (Fig. 3, healthy hemisphere), directed connectivity was almost

78 identical across conditions in the connectivity estimates corrected for aBP oscillations (Fig. 4, healthy
79 hemisphere); the respective three-way interaction between *direction*, *condition* and *VAR model type*
80 failed to reach significance, though ($F(1,1212) = 3.1$, $p = .077$). Similarly, the significant interaction
81 between *condition* and *VAR model type* ($F(1,1212) = 13.6$, $p = .0002$) and the respective post-hoc
82 comparisons demonstrated, that the increase in overall connectivity strength induced by metronomic
83 breathing was absent after intra-individually adjusting for aBP oscillations. Accordingly, the main
84 effect for *VAR model type* showed that connectivity was attenuated by including aBP in the VAR
85 model ($F(1,1212) = 56.2$, $p < .0001$). Main effects for *direction* ($F(1,12) = 36.8$, $p < .0001$) and
86 *condition* ($F(1,1212) = 28.0$, $p < .0001$) again showed that connectivity in rostro-caudal direction and
87 during metronomic breathing was stronger than in caudo-rostral direction and during resting-state,
88 respectively. No further effects were significant (all $p > .206$).

89 **Supplementary Analysis: Model S7**

90 For the sake of completeness, we also fitted this model to the data of the affected hemisphere (Model
91 S7; see Supplementary Table S3 for an overview of all fixed effects). As indicated by Figures 3 and 4
92 (affected hemisphere), the three-way interaction between *direction*, *condition* and *VAR model type* was
93 not significant ($F(1,1223) = 0.01$, $p = .914$), i.e. correcting for aBP oscillations had no effect on the
94 condition independent rostro-caudal gradient in the affected hemisphere. Similar as in the healthy
95 hemisphere, the significant interaction between *condition* and *VAR model type* ($F(1,1223) = 14.4$, $p =$
96 $.0002$) revealed that the increase in overall connectivity strength induced by metronomic breathing
97 disappeared after intra-individually adjusting for aBP oscillations. Again, the main effect for *VAR*
98 *model type* showed that connectivity was attenuated by including aBP in the VAR model ($F(1,1223) =$
99 83.6 , $p < .0001$). Main effects for *direction* ($F(1,12) = 6.1$, $p = .029$) and *condition* ($F(1,1223) = 14.3$,
100 $p = .0002$) again showed that connectivity in rostro-caudal direction and during metronomic breathing
101 was stronger than in caudo-rostral direction and during resting-state, respectively. No further effects
102 were significant (all $p > .186$).

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104 **Supplementary Table S1: Predicted marginal means for significant effects**
 105 **in the linear mixed models**

Model (Figures)	Effect	Factor Level	Estimate [SE]	Lower CL	Upper CL	
Model 1 DC LMM (Figure 3)	direction	rost.→caud.	.53 [.03]	.47	.59	
		caud.→rost.	.37 [.02]	.32	.42	
	condition	resting	.39 [.02]	.36	.43	
		breathing	.50 [.02]	.47	.54	
	direction × condition × hemisphere	resting	healthy	.48 [.03]	.41	.55
			affected	.46 [.03]	.39	.53
		breathing	healthy	.64 [.03]	.57	.71
			affected	.54 [.03]	.47	.61
		resting	healthy	.30 [.03]	.25	.36
			affected	.33 [.03]	.27	.39
		caud.→rost.	healthy	.39 [.03]	.33	.44
			affected	.45 [.03]	.39	.51
	Model 2 PDC LMM (aBP corrected connectivity; Figure 4)	direction	rost.→caud.	.42 [.03]	.36	.47
			caud.→rost.	.26 [.02]	.22	.30
hemisphere		healthy	.35 [.02]	.31	.39	
		affected	.33 [.02]	.29	.36	
direction × hemisphere		rost.→caud.	healthy	.45 [.03]	.39	.51
			affected	.38 [.03]	.32	.44
		caud.→rost.	healthy	.25 [.02]	.21	.30
			affected	.27 [.02]	.23	.32
Model 4 DC LMM with fNIRS PSD covariate (Figure 7)	direction	rost.→caud.	.53 [.03]	.46	.59	
		caud.→rost.	.37 [.02]	.32	.42	
	condition	resting	.40 [.02]	.37	.43	
		breathing	.50 [.02]	.46	.53	
	<u>PSD_{fNIRS}</u>		.005 [.002]	.001	.009	
	direction × hemisphere × <u>PSD_{fNIRS}</u>	rost.→caud.	healthy	.013 [.004]	.005	.020
			affected	.002 [.003]	-.005	.009
		caud.→rost.	healthy	-.002 [.004]	-.009	.006
			affected	.007 [.003]	.001	.014
	Model S1 DC LMM (resting state time windows)	direction	rost.→caud.	.48 [.03]	.42	.55
caud.→rost.			.32 [.02]	.27	.37	
direction × hemisphere		rost.→caud.	healthy	.49 [.03]	.42	.55
			affected	.47 [.03]	.41	.54
		caud.→rost.	healthy	.31 [.02]	.26	.36
			affected	.33 [.02]	.28	.38
Model S2 DC LMM (dxyHb; Figure S1)		direction	rost.→caud.	.48 [.03]	.42	.54
			caud.→rost.	.35 [.02]	.31	.39
	condition	resting	.38 [.02]	.34	.41	
		breathing	.46 [.02]	.42	.49	
Model S3 DC LMM (oxyHb; Figure S1)	condition	resting	.46 [.02]	.42	.49	
		breathing	.58 [.02]	.54	.62	
Model S4	direction	rost.→caud.	.39 [.03]	.33	.45	

Model (Figures)	Effect	Factor Level	Estimate [SE]	Lower CL	Upper CL
PDC LMM (dxyHb; Figure S2)		caud.→rost.	.27 [.02]	.23	.31
	direction	rost.→caud.	.37 [.03]	.31	.42
		caud.→rost.	.28 [.02]	.23	.33
Model S5 PDC LMM (oxyHb; Figure S2)	direction × hemisphere	rost.→caud. <u>healthy</u>	.39 [.03]	.33	.45
		rost.→caud. <u>affected</u>	.35 [.03]	.29	.41
		caud.→rost. <u>healthy</u>	.27 [.02]	.22	.32
		caud.→rost. <u>affected</u>	.29 [.02]	.24	.34
Model S6 DC vs. PDC LMM (healthy hemisphere; Figure 4 vs Figure 5)	direction	rost.→caud.	.50 [.03]	.45	.56
		caud.→rost.	.30 [.02]	.26	.34
	condition	resting	.37 [.02]	.33	.40
		breathing	.44 [.02]	.40	.47
	VAR model type	DC	.45 [.02]	.42	.49
		PDC	.35 [.02]	.32	.39
	condition × VAR model type	resting <u>DC</u>	.39 [.02]	.35	.43
		resting <u>PDC</u>	.34 [.02]	.30	.38
	breathing <u>DC</u>	.51 [.02]	.47	.55	
		breathing <u>PDC</u>	.36 [.02]	.32	.40
Model S7 DC vs. PDC LMM (affected hemisphere; Figure 4 vs Figure 5)	direction	rost.→caud.	.44 [.03]	.38	.50
		caud.→rost.	.33 [.02]	.28	.38
	condition	resting	.36 [.02]	.33	.39
		breathing	.41 [.02]	.38	.44
	VAR model type	DC	.45 [.02]	.41	.48
		PDC	.33 [.02]	.30	.36
	condition × VAR model type	resting <u>DC</u>	.40 [.02]	.36	.43
		resting <u>PDC</u>	.33 [.02]	.29	.36
	breathing <u>DC</u>	.49 [.02]	.46	.53	
		breathing <u>PDC</u>	.33 [.02]	.29	.36

106 NB: Estimates and confidence limits were obtained using the lsmeans package (Lenth 2016) with Satterthwaite
107 approximation of degrees of freedom. For effects involving the continuous predictor PSD_{fNIRS} (underlined) the
108 estimates represent its slopes, while for effects only involving discrete predictors the estimates refer to the
109 predicted marginal means on the given factor level. Abbreviations: caud., caudal; CL, confidence limits; DC,
110 directed coherence; LMM, linear mixed model; PDC, partial directed coherence; PSD_{fNIRS}, power spectral
111 density of the fNIRS signal; rost., rostral; SE, standard error; VAR, vector autoregressive.

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113 **Supplementary Table S2: Random effects for linear mixed models**

Model	Factor	Type	Variance
Model 1 DC LMM	participant	intercept	.0024
	connection	intercept	.0074
		slope for direction	.0200
	residual		.0617
Model 2 PDC LMM (aBP corrected connectivity)	participant	intercept	.0027
	connection	intercept	.0057
		slope for direction	.0126
	residual		.0465
Model 4 DC LMM with fNIRS PSD covariate	participant	intercept	.0013
	connection	intercept	.0074
		slope for direction	.0200
	residual		.0612
Model S1 DC LMM (resting state time windows)	participant	intercept	.0022
	connection	intercept	.0089
		slope for direction	.0231
	residual		.0557
Model S2 DC LMM (dxyHb)	participant	intercept	.0021
	connection	intercept	.0071
		slope for direction	.0165
	residual		.0677
Model S3 DC LMM (oxyHb)	participant	intercept	.0018
	connection	intercept	.0014
		slope for direction	.0051
	residual		.0632
Model S4 PDC LMM (dxyHb)	participant	intercept	.0020
	connection	intercept	.0056
		slope for direction	.0132
	residual		.0515
Model S5 PDC LMM (oxyHb)	participant	intercept	.0052
	connection	intercept	.0027
		slope for direction	.0053
	residual		.0419
Model S6 DC vs. PDC LMM (healthy hemisphere)	participant	intercept	.0016
	connection	intercept	.0055
		slope for direction	.0118
	residual		.0567
Model S7 DC vs. PDC LMM (affected hemisphere)	participant	intercept	.0016
	connection	intercept	.0079
		slope for direction	.0223
	residual		.0529

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115 **Supplementary Table S3: Type III statistics for supplementary models**

Model (Figures)	Effect	df	Error df	F value	p value
Model S1 DC LMM (resting state time windows)	direction	1	12	12.90	.0037
	time window	3	2460	1.09	.3513
	hemisphere	1	2460	.44	.5053
	direction × time window	3	2460	.48	.6961
	direction × hemisphere	1	2460	4.89	.0272
	time window × hemisphere	3	2460	.01	.9995
	direction × time window × hemisphere	3	2460	.11	.9559
Model S2 DC LMM (dxyHb; Figure S1)	direction	1	12	11.07	.0060
	condition	1	1223	28.63	1 × 10⁻⁷
	hemisphere	1	1223	1.17	.2806
	direction × condition	1	1223	.55	.4602
	direction × hemisphere	1	1223	1.73	.1881
	condition × hemisphere	1	1223	.13	.7228
Model S3 DC LMM (oxyHb; Figure S1)	direction × condition × hemisphere	1	1223	2.04	.1531
	direction	1	12	.78	.3943
	condition	1	1212	76.02	< 10⁻¹⁵
	hemisphere	1	1212	.09	.7590
	direction × condition	1	1212	.99	.3205
	direction × hemisphere	1	1212	3.77	.0525
Model S4 PDC LMM (aBP corrected connectivity; dxyHb; Figure S2)	condition × hemisphere	1	1212	.02	.9037
	direction × condition × hemisphere	1	1212	2.87	.0903
	direction	1	12	11.55	.0053
	condition	1	1223	1.46	.2274
	hemisphere	1	1223	.81	.3677
	direction × condition	1	1223	.94	.3312
Model S5 PDC LMM (aBP corrected connectivity; oxyHb; Figure S2)	direction × hemisphere	1	1223	1.97	.1607
	condition × hemisphere	1	1223	1.39	.2387
	direction × condition × hemisphere	1	1223	.34	.5620
	direction	1	12	13.74	.0030
	condition	1	1212	.72	.3974
	hemisphere	1	1212	.24	.6246
Model S6 DC vs. PDC LMM (healthy hemisphere; Figure 4 vs Figure 5)	direction × condition	1	1212	1.81	.1789
	direction × hemisphere	1	1212	8.42	.0038
	condition × hemisphere	1	1212	.21	.6438
	direction × condition × hemisphere	1	1212	.39	.5318
	direction	1	12	36.83	.0001
	condition	1	1212	28.02	1 × 10⁻⁷
Model S7 DC vs. PDC LMM (affected hemisphere; Figure 4 vs Figure 5)	VAR model type (DC vs. PDC)	1	1212	56.19	1 × 10⁻¹³
	direction × condition	1	1212	1.60	.2064
	direction × VAR model type	1	1212	.24	.6215
	condition × VAR model type	1	1212	13.60	.0002
	direction × condition × VAR model type	1	1212	3.13	.0770
Model S7 DC vs. PDC LMM (affected hemisphere; Figure 4 vs Figure 5)	direction	1	12	6.13	.0291
	condition	1	1223	14.32	.0002
	VAR model type (DC vs. PDC)	1	1223	83.64	< 10⁻¹⁵
	direction × condition	1	1223	1.75	.1856

Model (Figures)	Effect	df	Error df	F value	p value
	direction × VAR model type	1	1223	.09	.7588
	condition × VAR model type	1	1223	14.36	.0002
	direction × condition × VAR model type	1	1223	.01	.9141

116 NB: Tests of linear mixed models (LMM) were performed using the lmerTest package (Kuznetsova et al. 2016),
 117 with Satterthwaite approximation of degrees of freedom. Abbreviations: DC, directed coherence; df, degrees of
 118 freedom; LMM, linear mixed model; PDC, partial directed coherence; VAR, vector autoregressive.

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120 **References**

- 121 Cui X, Bray S, Reiss AL (2010) Functional near infrared spectroscopy (NIRS) signal improvement
122 based on negative correlation between oxygenated and deoxygenated hemoglobin dynamics.
123 *Neuroimage* 49:3039–46. doi: 10.1016/j.neuroimage.2009.11.050
- 124 Kirilina E, Jelzow A, Heine A, et al (2012) The physiological origin of task-evoked systemic artefacts
125 in functional near infrared spectroscopy. *Neuroimage* 61:70–81. doi:
126 10.1016/j.neuroimage.2012.02.074
- 127 Kuznetsova A, Bruun Brockhoff P, Haubo Bojesen Christensen R (2016) lmerTest: Tests in Linear
128 Mixed Effects Models
- 129 Lenth R V (2016) Least-Squares Means: The R Package lsmeans. *J Stat Softw* 69:1–33. doi:
130 10.18637/jss.v069.i01
- 131 Obrig H, Neufang M, Wenzel R, et al (2000) Spontaneous low frequency oscillations of cerebral
132 hemodynamics and metabolism in human adults. *Neuroimage* 12:623–39. doi:
133 10.1006/nimg.2000.0657
- 134 Santosa H, Aarabi A, Perlman SB, Huppert TJ (2017) Characterization and correction of the false-
135 discovery rates in resting state connectivity using functional near-infrared spectroscopy. *J*
136 *Biomed Opt* 22:55002. doi: 10.1117/1.JBO.22.5.055002
- 137 Satterthwaite TD, Wolf DH, Loughead J, et al (2012) Impact of in-scanner head motion on multiple
138 measures of functional connectivity: relevance for studies of neurodevelopment in youth.
139 *Neuroimage* 60:623–32. doi: 10.1016/j.neuroimage.2011.12.063
- 140 Sutoko S, Chan YL, Obata A, et al (2019) Denoising of neuronal signal from mixed systemic low-
141 frequency oscillation using peripheral measurement as noise regressor in near-infrared imaging.
142 *Neurophotonics* 6:015001. doi: 10.1117/1.NPh.6.1.015001
- 143 Zhang Q, Strangman GE, Ganis G (2009) Adaptive filtering to reduce global interference in non-
144 invasive NIRS measures of brain activation: How well and when does it work? *Neuroimage*

145 45:788–794. doi: 10.1016/j.neuroimage.2008.12.048

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