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***Title:* EVALUATING THE EFFECTS OF ORAL CONTRACEPTIVE USE ON BIOMARKERS AND BODY COMPOSITION DURING A COMPETITIVE SEASON IN COLLEGIATE FEMALE SOCCER PLAYERS**

*Running Heading:* EFFECTS OF ORAL CONTRACEPTIVE USE IN FEMALE ATHLETES

Brittany N. Bozzini<sup>1,2</sup>, Bridget A. McFadden<sup>1,2</sup>, Kirsty J. Elliott-Sale<sup>3</sup>, Paul A. Swinton<sup>4</sup>, and Shawn M. Arent<sup>1,2</sup>

<sup>1</sup>Department of Exercise Science, University of South Carolina, Columbia, SC, USA

<sup>2</sup>IFNH Center for Health and Human Performance, Rutgers, The State University of New Jersey, New Brunswick, NJ, USA

<sup>3</sup>Department of Sport Science, Sport, Health and Performance Enhancement (SHAPE) Research Centre, Nottingham Trent University, Nottingham, UK

<sup>4</sup>School of Health Sciences, Robert Gordon University, Aberdeen, Scotland, UK

*Author Contributions:*

BB, BM, KS, and SA conceived and designed the experiments. BB, BM, and SA performed the experiments. PS and BB analyzed the data and PS, BB, BM, KS, and SA interpreted the data analysis. SA contributed materials/tools. BB, BM, KS, PS, and SA wrote the paper. All authors read and approved the final manuscript.

*Corresponding Author:*

Shawn M. Arent, Ph.D., CSCS\*D, FISSN, FACSM  
Professor & Chair, Dept. of Exercise Science  
Director, U of SC Sport Science Lab  
Arnold School of Public Health  
University of South Carolina  
921 Assembly St., Office 216B  
Columbia, SC 29208  
sarent@mailbox.sc.edu

*ORCID:*

Brittany N. Bozzini: 0000-0002-2605-8644  
Bridget A. McFadden: 0000-0002-8626-9531  
Kirsty J. Elliott-Sale: 0000-0003-1122-5099  
Paul A. Swinton: 0000-0001-9663-0696  
Shawn M. Arent: 0000-0003-0647-0591

1 *Title:* **EVALUATING THE EFFECTS OF ORAL CONTRACEPTIVE USE ON**  
2 **BIOMARKERS AND BODY COMPOSITION DURING A COMPETITIVE SEASON IN**  
3 **COLLEGIATE FEMALE SOCCER PLAYERS**

4  
5 **ABSTRACT**

6 High training demands throughout the competitive season in female collegiate soccer  
7 players have been shown to induce changes in biomarkers indicative of stress, inflammation, and  
8 reproduction, which may be exacerbated in athletes using oral contraceptives (OCs). **Purpose:**  
9 To compare biomarkers and body composition between OC-using and non-using (CON) female  
10 soccer players throughout a competitive season. **Methods:** Female collegiate soccer players were  
11 stratified into two groups based on their reported OC use at the start of pre-season (OC: n=6;  
12 CON: n=17). Prior to the start of pre-season and immediately post-season, athletes underwent a  
13 battery of performance tests. Blood draws and body composition assessments were performed  
14 prior to pre-season, on weeks 2, 4, 8, and 12 of the season, and post-season. **Results:** Area-  
15 under-the-curve ratios (OC<sub>AUC</sub>:CON<sub>AUC</sub>) indicated the OC group were exposed to substantially  
16 higher levels of sex-hormone binding globulin (AUC<sub>ratio</sub>=1.4, probability=p>0.999), total cortisol  
17 (1.7; p>0.999), c-reactive protein (5.2; p>0.999), leptin (1.4; p=0.990), growth hormone (1.5;  
18 p=0.97), but substantively lower amounts of estradiol (0.36; p<0.001), progesterone (0.48;  
19 p=0.008), free testosterone (0.58; p<0.001), follicle-stimulating hormone (0.67; p<0.001) and  
20 creatine kinase (0.33, p<0.001) compared with the CON across the season. Both groups  
21 increased fat free mass over the season, but CON experienced a greater magnitude of increase  
22 along with decreased body fat percentage. **Conclusion:** Although similar training loads were  
23 observed between groups over the season, the elevated exposure to stress, inflammatory, and

24 metabolic biomarkers over the competitive season in OC users may have implications on body  
25 composition, training adaptations, and recovery in female athletes.

26  
27 **KEY WORDS:** female athletes, hormonal contraceptives, training loads, performance

28  
29 **NEW & NOTEWORTHY:** This study highlights the influence of OC use on physiological  
30 changes that occur over a four-month intense, competitive season and the differential systemic  
31 exposure to biomarkers, specifically those of inflammation, stress, anabolism, and energy  
32 balance, between OC-using and non-using soccer players. Additionally, this study provides  
33 insight into changes in body composition with prolonged training between female athletes with  
34 and without OC use.

## 35 36 **1. INTRODUCTION**

37 Due to its power-endurance nature, soccer is a physically demanding sport, which is  
38 compounded by the stress of academics, frequent travel, and environmental stressors in  
39 collegiate players (19). Athlete-monitoring methods, such as heart rate (HR) and global  
40 positioning systems (GPS), allow for the assessment of internal and external workloads and  
41 recovery during training and competition; however tracking changes in blood biomarkers may  
42 offer a more comprehensive picture of the cumulative demands of a collegiate season outside of  
43 just on-field training sessions (2). In National Collegiate Athletic Association (NCAA) Division  
44 I (DI) soccer, the high training demands throughout the competitive season have been shown to  
45 induce changes in biomarkers of stress and reproduction in male (24, 26) and female players  
46 (51). Chronic elevations in stress and inflammatory biomarkers such as cortisol and interleukin-6

47 (IL-6) and decreases in reproductive markers (e.g. testosterone, estrogen) amongst other  
48 biomarker changes can be indicative of inadequate recovery (29), and thus have implications on  
49 performance (26) and health (17).

50 Current research shows that the majority of elite female athletes have at some point in  
51 their career taken hormonal contraceptives (HC), with almost half (49.5%) reporting current HC  
52 usage (31). Of the various HC methods reported, oral contraceptives (OC) were the most widely  
53 used (78.4%) amongst female athletes (31). As such, it is important to understand any  
54 implications HCs, especially OCs, have on training adaptations, recovery, and performance. HC  
55 use is a potential confounding factor in the stress response from training in female athletes due to  
56 the overlap between hypothalamic-pituitary-adrenal (HPA) and hypothalamic-pituitary-gonadal  
57 (HPG) axes (32, 35). In females, HCs modify normal hormonal fluctuations, suppressing  
58 endogenous production of estrogen and progesterone (43). HPA-axis activation inhibits the  
59 HPG-axis, through the influence of corticotropin-releasing hormone (CRH) on gonadotropin-  
60 releasing hormone (GnRH) either directly or indirectly through  $\beta$ -endorphin or cortisol (32).  
61 Cortisol, whose production can also be stimulated by vasopressin (AVP) during stress, acts to  
62 inhibit all levels of the HPG-axis beyond just GnRH (32). A recent study investigating the effects  
63 of OC use on the HPA-axis demonstrated that OCs alter the activation of the HPA-axis by  
64 increasing circulating levels of cortisol, thereby inducing metabolic alterations such as increasing  
65 circulating levels of triglycerides (23). This finding demonstrates that OC use may have an  
66 analogous impact on the HPA-axis as training, with both activating this stress response.  
67 Therefore, OC use in conjunction with training, particularly during times of high training  
68 demands, such as during the competitive soccer season (51), may produce an augmented stress  
69 response in female athletes.

70 OC use has also been linked to increased c-reactive protein (CRP) levels at rest in female  
71 athletes, but not other acute phase proteins (13). Moreover, this finding has been shown in active  
72 females who underwent 10-weeks of high intensity training as HC users (7 out of 8 subjects on  
73 OCs) displayed increased CRP levels as well as reduced lean mass gains post-intervention than  
74 the non-HC users (25). In elite female athletes, increased resting cortisol concentrations (6) and  
75 blunted cortisol responses to high intensity training sessions have been reported with OC use  
76 (15). In addition to the blunted cortisol responses, elite female hockey players on OCs also had  
77 decreased resting testosterone levels and a reduced testosterone response to training over 15 days  
78 compared to their non-user teammates (15). This mirrors previous findings in which OC use had  
79 been shown to decrease free testosterone and increase sex hormone-binding globulin (SHBG)  
80 levels in healthy women (52). As such, changes in biomarkers may be exacerbated or altered in  
81 athletes using OCs in response to prolonged periods of intense training. This possible enhanced  
82 activation of stress and inflammatory responses in female athletes using OCs may indicate a  
83 greater recovery need. Furthermore, side effects such as increased in body weight or fat mass  
84 have been reported in female endurance athletes and active females on OCs (12, 41), which may  
85 impact performance outcomes; however, these findings have not been consistent (40, 41). The  
86 purpose of this study was to compare biomarker and body composition responses in female  
87 soccer players with and without OC use during a NCAA DI competitive soccer season. It was  
88 hypothesized that the players using OCs would have altered physiological responses compared to  
89 their non-user counterparts over the competitive season.

## 91 **2. METHODS**

### 92 *2.1 Experimental Design*

93 Female collegiate soccer players were monitored throughout a competitive fall season to  
94 determine the effects of OC use on body composition and biomarkers indicative of stress,  
95 inflammation, reproduction, anabolism, metabolism, and hematological status. Prior to the start  
96 of pre-season, players underwent maximal performance testing that was used to determine their  
97 endurance and power characteristics as well as to individualize each athlete's Polar TeamPro  
98 monitor. The Polar TeamPro system utilized GPS, accelerometry, and HR monitoring technology  
99 to determine training load (TL) and exercise energy expenditure (EEE) for all team training  
100 sessions, practices, and games. Additionally, body composition and biomarkers assessments  
101 were performed prior to pre-season as well as on weeks 2, 4, 8, 12, and immediately post-season  
102 (*Figure S1*; DOI: <http://doi.org/10.6084/m9.figshare.12996794>).

## 104 *2.2 Participants*

105 Female collegiate soccer players (N=30) were monitored throughout the course of the  
106 competitive season. Players were stratified into two groups: oral contraceptive (OC: n=6; Mean  
107  $\pm$ SD: age=19 $\pm$ 1yr; weight= 67.6 $\pm$ 3.0 kg; height= 168.4 $\pm$ 4.4 cm) and control (CON: n=17;  
108 age=19 $\pm$ 1yr; weight= 66.0 $\pm$ 8.0 kg; height= 168.2 $\pm$ 6.5 cm) based on their reported OC use. OC  
109 usage was determined by a Menstrual Status Questionnaire completed prior to the start of pre-  
110 season, and was also repeated post-season for confirmation of OC status. At baseline, all OC  
111 players reported at least one-year of OC use and all CON players reported menstrual cycle  
112 lengths of 25-35 days. Self-reported age of menarche was 13 $\pm$ 1 years for the CON group and  
113 14 $\pm$ 2 years for the OC group. Players were excluded from analysis if they were using intrauterine  
114 contraception (n=4), altered contraception method mid-season (n=1), did not participate in team  
115 training (n=1), or had a known metabolic disorder (n=1). Written, informed consent was

116 obtained from all subjects prior to participation and all subjects received clearance by the  
117 university Sports Medicine staff prior to testing. All players competed on the same NCAA DI  
118 women's soccer team in the Big Ten Conference. Research was approved by the University's  
119 Institutional Review Board for the Protection of Human Subjects and conducted in accordance  
120 with the Declaration of Helsinki.

### 121 122 *2.3 Performance Testing*

123 Prior to the start of pre-season and upon completion of the competitive season, players  
124 underwent a battery of performance tests and body composition assessments. All pre- and post-  
125 season testing sessions, as well as blood draws, occurred within a one-week period. Prior to the  
126 start of season, players reported to the lab  $\geq 2$  hours fasted and having refrained from exercise in  
127 the preceding 12-hours. Body composition was assessed using air displacement plethysmography  
128 via the BodPod (BODPOD, COSMED, Concord, CA, USA) with a predicted lung volume via  
129 the Brozek formula (7, 16) to determine percent body fat (BF%) and fat free mass (FFM). After a  
130 ~10-minute standardized dynamic warm-up, players performed maximal countermovement  
131 vertical jumps with hands-on-hips (CMJ<sub>HOH</sub>) on a contact mat (Probotics Inc., Huntsville, AL,  
132 USA) (36). Players were allowed two attempts with highest jump height recorded.

133 Afterwards, a maximal graded exercise test (GXT) on a treadmill was used to measure  
134 maximal aerobic capacity ( $VO_{2max}$ ) and ventilatory threshold (VT) via direct gas exchange by a  
135 COSMED Quark CPET (COSMED, Concord, CA, USA). HR was continuously monitored  
136 throughout the test using a Polar S610 HR monitor to obtain maximal heart rate (HR<sub>max</sub>) (Polar  
137 Electro Co., Woodbury, NY, USA). A speed-based protocol was used with stages that were  
138 metabolic equivalents (MET) to the standard Bruce protocol. This protocol has previously been



139 used in collegiate soccer players and consisted of two-minute stages at a constant 2% incline,  
140 with increasing speeds of 6.4, 7.9, 10.0, 11.7, 13.7, 15.6, 17.1, 18.2, 19.8, 21.1 km/h (34).  
141 Players continued the test with encouragement from research assistants until volitional fatigue.  
142 At least two of the following criteria were met for attainment of  $VO_{2max}$ :  $RER \geq 1.1$ , observation  
143 of a plateau in  $O_2$  consumption (increase  $\leq 150$  ml/min with increasing workload), and  $HR > 85\%$   
144 age-predicted  $HR_{max}$  ( $208 - 0.7 \times \text{age}$ ). For athletes who did not meet the above criteria,  $VO_{2peak}$   
145 was used ( $n=3$ ). Player's VT was analyzed after the completion of each test as the inflection  
146 point where  $VCO_2$  increased nonlinearly with  $VO_2$ , expressed as a percentage of  $VO_{2max}$  (5).

147 All performance tests were repeated post-season and body composition assessments were  
148 repeated during all blood draw timepoints in addition to post-season. One athlete at baseline  
149 ( $n=1$ ) and four athletes at post-testing ( $n=4$ ) were limited in participation for maximal testing by  
150 the team physician and did not participate in all testing sessions (see *Table 8*).

#### 151 152 *2.4 Blood Draws*

153 Blood draws were performed prior to pre-season, on weeks 2 (end of pre-season), 4, 8, &  
154 12 of the season, and post-season. Athletes reported to the lab between 0700 and 0900h and were  
155 instructed to arrive in an euhydrated state following an overnight fast. All draws during the  
156 season were performed between 18-24 hours following a game (T2-T5), with the exception of  
157 pre-season (T1: 'baseline') and post-season draws (T6: ~58h post-game). The T2 blood draw  
158 was performed in order to assess changes in biomarkers following pre-season in which  
159 workloads are the highest for the athletes, while the T6 blood draw offered a snapshot of  
160 recovery post-season. For all draws, blood samples were drawn from participants while seated  
161 via the antecubital fossa (21G, BD Vacutainer, Safety-Lok) by three experienced phlebotomists

162 into clot activator collection tubes (SST and gel-free tubes). Blood samples were centrifuged for  
163 10-minutes at 4,750 rpm (Allegra x-15R; Beckman Coulter, Brea, CA, USA), serum/plasma  
164 were aliquoted from centrifuged tubes and immediately shipped, in containers designed to  
165 maintain 4°, 20°, or -20°C depending on the analyte, to a Clinical Laboratory Improvements  
166 Amendment (CLIA)-certified processing facility for analysis (Quest Diagnostics, Secaucus, NJ,  
167 USA). Samples were run in duplicate and the coefficient of variation (CV) was between 0.5-  
168 10.0% for all biomarkers. Results were provided to the researchers via the Quest Diagnostics  
169 Care360 online portal. Biomarkers analyzed included total cortisol (TCORT), free cortisol  
170 (FCORT), creatine kinase (CK), CRP, IL-6, tumor necrosis factor- $\alpha$  (TNF- $\alpha$ ), estradiol (E<sub>2</sub>),  
171 growth hormone (GH), insulin-like growth factor-1 (IGF-1), ferritin (Fer), iron (Fe), total iron  
172 binding capacity (TIBC), percent transferrin saturation (%SAT), transferrin, leptin, total  
173 triiodothyronine (TT<sub>3</sub>), free triiodothyronine (FT<sub>3</sub>), total thyroxine (TT<sub>4</sub>), free thyroxine (FT<sub>4</sub>),  
174 thyroid-stimulating hormone (TSH), prolactin, sex-hormone binding globulin (SHBG), follicle-  
175 stimulating hormone (FSH), progesterone (P<sub>4</sub>), total testosterone (TTEST), and free testosterone  
176 (FTEST).

### 177 178 *2.5 In-season athlete-monitoring*

179 Players were evaluated during all team training sessions using the Polar TeamPro system  
180 during the fall competitive season. The Polar TeamPro system utilized GPS, accelerometry, and  
181 HR technology to determine TL and EEE (14, 18, 21) for all lifts, practices, and games. The  
182 Polar TeamPro system was individualized to each athlete using their pre-season testing results of  
183 height, weight, age, VO<sub>2max</sub>, HR<sub>max</sub>, and HR<sub>VT</sub>. During the season, daily TL and EEE data were  
184 downloaded from the athletes' monitors by the researchers and then averaged weekly throughout

185 the season. TL, expressed as arbitrary units (au), was calculated via an algorithm developed by  
186 Polar™ based on the training impulse concept and factors in an athlete's HR responses, caloric  
187 expenditure, and mechanical impact incurred during a training session as well as the duration of  
188 the session. EEE was normalized for body weight (EEE<sub>REL</sub>, expressed as kcal/kg), which was  
189 obtained from body composition assessments, in order to account for relative size differences  
190 between players.

## 192 *2.6 Statistical Analysis*

193 The purpose of the statistical analysis was to model the time series nature of biomarker  
194 and body composition data and assess the extent to which values changed across the season for  
195 both OC and CON groups. To conduct the analyses, hierarchical generalized linear models  
196 (HGLMs) were fitted within a Bayesian framework. HGLMs accounted for structure in the data  
197 and were fitted to smooth the time series data, identifying the underlying shape of the  
198 physiological signal (38). With a Bayesian framework, dichotomous interpretations of results  
199 (*e.g.* with null hypothesis significance testing) can be avoided and greater emphasis placed on  
200 describing the most likely results and their practical consequences (27). Analogous to mixed-  
201 effect models with varying slopes, the HGLMs were fitted with a single common smoother plus  
202 group-level smoothers with the same “wiggleness” (38). The HGLMs also accounted for the  
203 repeated measures nature of the data by including random intercepts for each player. All models  
204 were fitted within the brms package (8) that interfaced with the Bayesian software Stan (10).  
205 Models were fitted with 5 chains each comprising 10,000 sets of posterior estimates. These  
206 model estimates with smoothers were then used to generate 50,000 new data sets to account for  
207 uncertainty in coefficients and variance parameters. Means were then calculated in each data set

208 across time intervals for both OC and CON groups. Visual inspection of the distribution of  
209 means revealed that most outcomes exhibited linear behavior (e.g. constant throughout the  
210 season or consistent increase/decrease). The proportion of gradients with for example a positive  
211 slope was interpreted as the probability of an increase in the outcome across the season. To  
212 quantify the magnitude of any change, effect sizes (Cohen's  $d$ ) were calculated for each data set  
213 by dividing the change in value across the season by the pre-season standard deviation. Effect  
214 sizes ( $d$ ) of 0.20, 0.50, and 0.80 were considered indicative of small, medium, and large effects,  
215 respectively. To quantify differences in biomarker levels across the season between OC and  
216 CON groups, the ratio of the area under the curve (AUC) was calculated. The distribution of all  
217 calculations across the generated data sets were used to derive percentage credible intervals  
218 (%CrIs). Descriptive statistics (Mean  $\pm$  SD) were used to quantify team, OC, and CON  
219 performance characteristics pre- and post-season. Frequency counts for OC and CON groups  
220 were used to present changes in performance from baseline values (increase, maintain, decrease)  
221 due to changes in sample size for each performance variable from pre- to post-season. Changes  
222 were considered an increase or decrease based on the sensitivity of the equipment to detect  
223 significant changes ( $\text{VO}_{2\text{max}}$ :  $\pm 2.3 \text{ ml}\cdot\text{kg}^{-1}\cdot\text{min}^{-1}$ ; VT:  $\pm 2.0\%$ ;  $\text{CMJ}_{\text{HOH}}$ :  $\pm 1.7 \text{ cm}$ ) (22, 36),  
224 otherwise no change (maintenance) was indicated.

### 226 3. RESULTS

#### 227 3.1 Reproductive markers: $E_2$ , $P_4$ , FSH, SHBG, TTEST, FTEST, Prolactin

228 Inspection of modelled time series indicated linear (constant or increasing/decreasing)  
229 responses for all reproductive biomarkers across the season. However, median point estimates  
230 describing linear changes were below a medium threshold ( $|d| < 0.5$ ) for all reproductive markers

231 (Table 1) in both OC (-0.38: FSH; to 0.14: TTEST) and CON (-0.27: SHBG; to 0.43: TTEST)  
232 groups. The area under the curve ratios indicated the OC users were exposed to substantively  
233 higher levels of SHBG (AUC ratio: 1.4 [95%CrI: 1.3 – 1.5];  $p>0.99$ ), but substantively lower  
234 levels of E<sub>2</sub> (AUC ratio: 0.36 [95%CrI: 0.11 – 0.61];  $p<0.001$ ), P<sub>4</sub> (AUC ratio: 0.48 [0.13 –  
235 0.89];  $p=0.008$ ), FTEST (AUC ratio: 0.58 [95%CrI: 0.47 – 0.70];  $p<0.001$ ), and FSH (AUC  
236 ratio: 0.67 [95%CrI: 0.51 – 0.85];  $p<0.001$ ) compared with the CON group across the season.  
237 Graphical outputs of Bayesian hierarchical linear models for the reproductive biomarkers are  
238 presented in *Figure S2*; DOI: <http://doi.org/10.6084/m9.figshare.12996794>.

239  
240 **Insert Table 1 here**

### 241 242 **3.2 Stress and inflammatory markers: TCORT, FCORT, CRP, IL-6, TNF- $\alpha$**

243 Inspection of modelled time series indicated linear responses for the majority of stress  
244 and inflammatory biomarkers across the season. Results indicated that OC users experienced a  
245 large increase for CRP ( $d=0.85$ ) and a moderate increase for IL-6 ( $d=0.66$ ) (Table 2). In  
246 contrast, median point estimates describing linear changes were below a medium threshold  
247 ( $|d|<0.5$ ) for all stress and inflammatory biomarkers in the CON group (0.10: CRP; to 0.46: IL-  
248 6) (Table 2). A non-linear response was identified for FCORT in both OC and CON groups, with  
249 values increasing between T1-T4 (combined  $d=0.40$ ; [50%CrI: 0.21 – 0.59]) followed by a  
250 return towards original values between T4-T6 (combined  $d=-0.23$ ; [50%CrI: -0.42 – 0.05]).  
251 During the season, both OC and CON groups also experienced a similar non-linear trend with  
252 decreasing TNF- $\alpha$  values between T1-T5 (combined  $d=-0.89$ ; [50%CrI: -1.1 – 0.57]), followed  
253 by a subsequent large increase between T5-T6 (combined  $d=1.2$ ; [50%CrI: 1.0 – 1.4]). The area

254 under the curve ratios indicated the OC group was exposed to a substantively greater amount of  
255 TCORT (AUC ratio: 1.7 [95%CrI: 1.6 – 1.8];  $p>0.99$ ) and CRP (AUC ratio: 5.2 [95%CrI: 3.7 –  
256 8.3];  $p>0.99$ ) compared with the CON group across the season. Graphical outputs of Bayesian  
257 hierarchical linear models for stress and inflammatory biomarkers are presented in *Figure S3*;  
258 DOI: <http://doi.org/10.6084/m9.figshare.12996794>.

260 **Insert Table 2 here**

### 262 **3.3 Markers of muscular growth and breakdown: GH, IGF-1, CK**

263 Linear responses were identified for all biomarkers indicative of growth and muscular  
264 breakdown across the season. The OC group experienced a large increase in GH ( $d=1.5$ ), but a  
265 moderate decrease in IGF-1 ( $d=-0.52$ ) across the season (*Table 3*). In contrast, median point  
266 estimates were below a medium threshold ( $|d|<0.5$ ) for all muscular anabolic and catabolic  
267 biomarkers in the CON group (-0.14: IGF-1; to -0.07: CK) (*Table 3*). The area under the curve  
268 ratios indicated OC users were exposed to substantively higher levels of GH (AUC ratio: 1.5  
269 [95%CrI: 0.97– 2.2];  $p=0.97$ ), but substantively lower levels of CK (AUC ratio: 0.33 [95%CrI:  
270 0.16 – 0.50];  $p<0.001$ ) compared with the CON group across the season. Graphical outputs of  
271 Bayesian hierarchical linear models for biomarkers of muscular growth and breakdown are  
272 presented in *Figure S4*; DOI: <http://doi.org/10.6084/m9.figshare.12996794>.

274 **Insert Table 3 here**

### 276 **3.4 Markers of iron status: Fe, Fer, %Sat, TIBC, Transferrin**

277 Linear responses were identified for the majority of biomarkers indicative of iron status  
278 in the athletes across the season. Both OC and CON groups were found to experience a moderate  
279 decrease in Fe ( $d=-0.51$ ,  $d=-0.56$ ), with the CON group also demonstrating a moderate increase  
280 in TIBC ( $d=0.63$ ) (*Table 4*). Similar non-linear responses were identified for %SAT with OC and  
281 CON groups experiencing a decrease between T1-T5 (combined  $d = -0.42$ ; [50%CrI: -0.60 – -  
282 0.23]), followed by a subsequent increase between T5-T6 (combined  $d= 0.34$ ; [50%CrI: 0.17 –  
283 0.51]). Graphical outputs of Bayesian hierarchical linear models for biomarkers of iron status are  
284 presented in *Figure S5*; DOI: <http://doi.org/10.6084/m9.figshare.12996794>.

285  
286 **Insert Table 4 here**

### 287 288 **3.5 Markers of metabolism: TSH, TT<sub>4</sub>, FT<sub>4</sub>, TT<sub>3</sub>, FT<sub>3</sub>, Leptin**

289 Linear responses were identified for all biomarkers indicative of metabolism and energy  
290 balance across the season. OC users were found to experience increases in the majority of  
291 biomarkers with large effects for TT<sub>4</sub> ( $d=0.91$ ) and leptin ( $d=1.2$ ), and moderate effects for TT<sub>3</sub>  
292 ( $d=0.71$ ) and FT<sub>3</sub> ( $d=0.78$ ), but a moderate effect for a decrease in FT<sub>4</sub> ( $d=-0.52$ ) (*Table 5*).  
293 Similarly, the CON group experienced moderate effects for increases in TT<sub>4</sub> ( $d=0.53$ ) and leptin  
294 ( $d=0.51$ ), and moderate effects for decreases in both TSH ( $d=-0.61$ ) and FT<sub>4</sub> ( $d=-0.70$ ) (*Table 5*).  
295 The area under the curve ratios indicated the OC group were exposed to substantially greater  
296 amounts of TSH (AUC ratio: 1.4 [95%CrI: 1.3– 1.6];  $p>0.99$ ), TT<sub>4</sub> (AUC ratio: 1.3 [95%CrI:  
297 1.2– 1.4];  $p>0.99$ ), TT<sub>3</sub> (AUC ratio: 1.3 [95%CrI: 1.2– 1.3];  $p>0.99$ ), and leptin (AUC ratio: 1.4  
298 [95%CrI: 1.3– 1.6];  $p>0.99$ ) compared with the CON group across the season. Graphical outputs

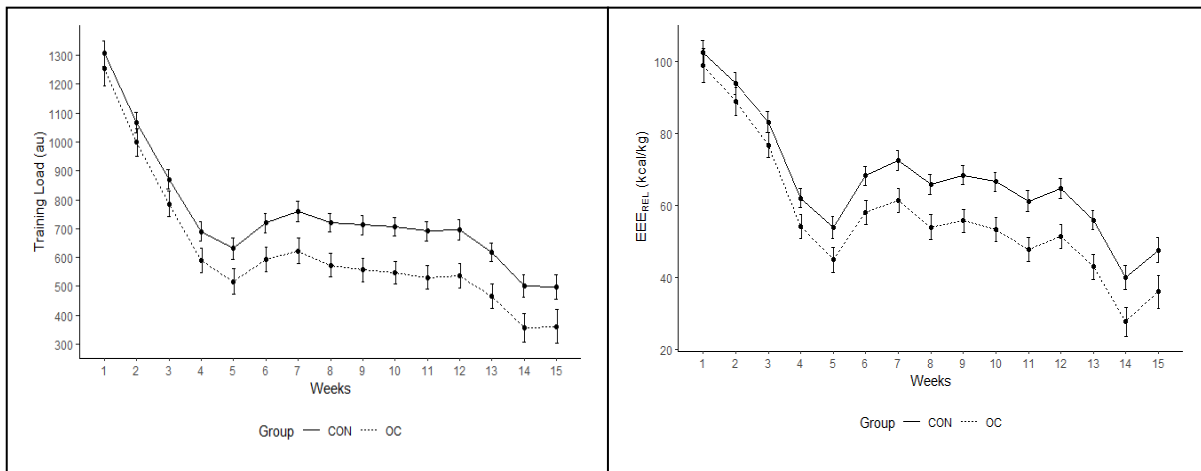
of Bayesian hierarchical linear models for metabolic biomarkers are presented in *Figure S6* DOI: <http://doi.org/10.6084/m9.figshare.12996794>.

**Insert Table 5 here**

### 3.6 Training Load / Exercise Energy Expenditure

Large linear decreases were found for TL and  $EEE_{REL}$  across the season (TL: combined  $d=-2.3$ ; [50%CrI: -2.5 – -2.1];  $EEE_{REL}$ : combined  $d=-2.2$ ; [50%CrI: -2.4 – -2.0]); however, OC users were identified to exhibit a lower TL (AUC ratio: 0.83 [95%CrI: 0.76 – 0.89];  $p<0.001$ ) and  $EEE_{REL}$  (AUC ratio: 0.85 [95%CrI: 0.79 – 0.90];  $p<0.001$ ) across the season than the CON group.

**Fig 1:** Changes in Training Load and Exercise Energy Expenditure Over Time



$EEE_{REL}$ : relative exercise energy expenditure; Plots illustrate smoothed data obtained from Bayesian hierarchical generalized linear models. Circles represent averages and error bars represent  $\pm$  standard deviations.

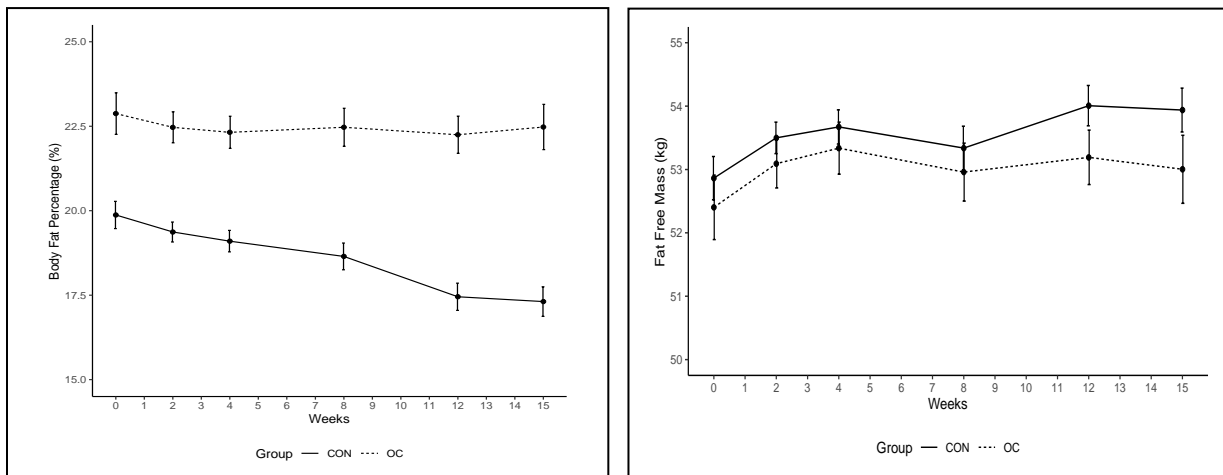
**Insert Table 6 here**



### 3.7 Body Composition

Investigation of body composition data indicated that both OC and CON groups maintained body mass across the season ( $d_{OC} = 0.04$  [50%CrI: -0.06 – 0.14];  $d_{CON} = -0.03$  [50%CrI: -0.09 – 0.04]; *Table 7*), with limited evidence that both groups increased FFM slightly ( $d_{OC} = 0.11$  [50%CrI: 0.02 – 0.20];  $d_{CON} = 0.20$  [50%CrI: 0.14 – 0.26]). The CON group also experienced moderate decreases in BF% ( $d_{CON} = -0.50$  [50%CrI: -0.58 – -0.43]), with no such changes identified for OC users ( $d_{OC} = -0.08$  [50%CrI: -0.19 – 0.04]; *Figure 2*).

**Fig 2:** Changes in Body Fat Percentage and Fat Free Mass Over the Season



326

Plots illustrate smoothed data obtained from Bayesian hierarchical generalized linear models. Circles represent averages and error bars represent  $\pm$  standard deviations.

Insert Table 7 here

### 3.8 Performance Variables

Team and group performance characteristics from pre- and post-season testing are presented in *Table 8*.

Insert Table 8 here

#### 4. DISCUSSION

The TLs and EEEs experienced by female collegiate soccer players throughout the competitive season corresponded with various perturbations in blood biomarkers and changes in body composition. TL and  $EEE_{REL}$  were highest for both groups during the first two-weeks of pre-season, with players experiencing reductions in workload as the season progressed. Between OC and CON groups; however, there were substantially different exposures to biomarkers of reproduction, stress, inflammation, metabolism, and muscular anabolism/catabolism throughout the competitive season. These differences were observed despite similar training loads, although OC users exhibited an accumulative 15% lower training load across the season. Yet, the OC group experienced substantially greater exposure to inflammatory and stress biomarkers than the CON group even with the reduced total workloads. Additionally, neither group exhibited changes in BM across the season; however, findings indicated that CON players experienced greater increases in FFM and substantially greater decreases in BF% compared with OC users. These findings indicate that although both groups displayed similar temporal biomarker responses overall, the relative magnitude of these responses to training were exacerbated in OC users, particularly for CRP, GH, and leptin. This study highlights the influence of OC use on physiological changes that occur over a four-month intense competitive season and the differential systemic exposure to biomarkers, specifically those of inflammation, stress, anabolism, and energy balance. These differences observed as a result of OC use may have implications on body composition, training adaptations, and recovery during the competitive season in female athletes.

357 Over the season, effect sizes revealed concentrations of sex hormones E<sub>2</sub> and P<sub>4</sub> were  
358 relatively stable; however, the CON group experienced a ~3x greater exposure to E<sub>2</sub> and ~2x  
359 greater exposure to P<sub>4</sub> compared to OC users over the season. This is expected as OCs act by  
360 suppressing endogenous production of E<sub>2</sub> and P<sub>4</sub> through the inhibition of the HPG-axis (43).  
361 Oral contraceptive-mediated suppression of ovarian hormone production is coupled with a  
362 decreased production and secretion of FSH and luteinizing hormone (LH) (43). This is supported  
363 by the finding that the CON group exhibited larger concentrations of FSH (~2x greater exposure)  
364 over the season than the OC group. Although LH concentrations and exogenous hormone doses  
365 were not quantified in this study, the differences in female reproductive hormones between OC  
366 and CON groups illustrate the typical reproductive hormonal profiles associated with OC use.  
367 Unlike the CON group, OC users experienced a small effect for a decreased FSH concentrations  
368 over the season. This increased suppression of FSH levels may in part be mediated by HPA-axis  
369 interactions and inhibition on the HPG-axis as TCORT was elevated in OC versus CON groups.  
370 Previous research has shown decreased FTEST and increased SHBG levels with OC use (52).  
371 This mirrored the findings in this study as the OC group had about ~2x less FTEST and ~1.5x  
372 greater SHBG exposure over the season compared with the CON group. This builds upon acute  
373 findings in elite athletes where salivary testosterone levels remained lower in OC users after  
374 exercise regardless of training session intensity (15). Finally, no differences in prolactin AUC  
375 were observed between groups. Prolactin levels can be influenced by IL-6 production (32),  
376 potentially explaining the similar prolactin levels across the season as both groups experienced  
377 similar increases in IL-6. Additionally, although the timing of blood draws in this study may  
378 have influenced the observed reproductive hormone concentrations in the CON group due to  
379 cyclic nature of fluctuations in sex hormones during a typical menstrual cycle, overall the

380 findings of this study underscore the consistent differences over time in circulating sex hormones  
381 in female athletes with and without OC use.

382           Across the season, athletes exhibited an initial increase in FCORT followed by a small  
383 decrease during the second-half of the season. This continued increase in FCORT in the first  
384 two-months of the season occurred despite dramatic decreases in weekly TL and  $EEE_{REL}$   
385 following pre-season. This increased catabolic environment observed in the first-half of the  
386 season may be a result of the high TL and  $EEE_{REL}$  that occurred during pre-season, where  
387 workloads were nearly double those observed from weeks 4 to 15 of the season. Previous  
388 research in collegiate fall-sport athletes has characterized the deleterious effects of a condensed  
389 pre-season (50, 51), with similar effect sizes observed for increased FCORT in female field-  
390 hockey players (50). The observed perturbations in FCORT described herein occurred earlier and  
391 to a smaller magnitude than those previously reported in female soccer players (51), which may  
392 point to differences in player management between studies. Interestingly, OC players were  
393 exposed to nearly ~2x greater TCORT throughout the season compared to CON players, with no  
394 differences in FCORT between groups. OC use has been shown to enhance corticosteroid-  
395 binding globulin binding capacity, which may influence circulating FCORT levels (53). In  
396 female athletes on OCs, increased resting cortisol concentrations have been reported (6) along  
397 with blunted acute cortisol responses to exercise (6, 15). This study adds further support to the  
398 notion that OCs alter the activation of the HPA-axis by increasing circulating levels of cortisol  
399 (23). Research regarding cortisol and OC use in athletes has, however, been equivocal. For  
400 example, Larsen and colleagues showed no differences in cortisol concentrations between elite  
401 female athletes on OCs (28); however, exercise participation prior to blood draws and time of  
402 day varied between subjects, potentially washing out any between group differences as both

403 factors have been shown to impact cortisol levels. The elevated TCORT levels across the season  
404 in the OC group may indicate an increased catabolic environment in these athletes and thus, a  
405 reduced capacity for protein synthesis (29), especially when taken in conjunction with the  
406 smaller FFM gains observed in OC users. The sustained elevated TCORT levels, along with the  
407 exacerbated inflammatory responses observed in OC athletes, may also have implications on  
408 recovery and immune function (29), through the inhibition of muscle protein synthesis (20) and  
409 immunosuppression (20, 44).

410 For inflammatory biomarkers, the athletes TNF- $\alpha$  levels decreased through week-12 of  
411 the season followed by an increase from weeks 12 to 15. Interestingly, this contrasting response  
412 in TNF- $\alpha$  is opposite that of FCORT over the season, and may be due to an interaction and  
413 feedback between FCORT, IL-6, and TNF- $\alpha$  responses (37). Compared with pre-season baseline  
414 values, OC users experienced large increases in CRP and moderate increases in IL-6 and TNF- $\alpha$   
415 concentrations, whereas the CON group had a small overall increase in IL-6. Thus, there appears  
416 to be greater inflammatory responses to training with OC use, despite the increased resting  
417 TCORT levels. This may lead to augmented systemic inflammation in these athletes as OC users  
418 exposure to CRP was over 5x greater than CON players over the season. This aligns with  
419 previous findings that have shown increased CRP at rest and in response to intense training with  
420 OC use (13, 25, 28). The heightened systemic inflammation seen with OCs may have long-term  
421 implications on athlete health as elevated CRP levels have been associated with an increased  
422 cardiovascular disease risk (39). Additionally, chronic inflammation may influence training  
423 adaptations, as reduced FFM gains and FM loss alongside elevated CRP levels have been shown  
424 over a 10-week training block (25) and similar changes in body composition measures were  
425 observed in this present study. It appears OCs may exacerbate inflammatory responses to

426 training, with the enhanced systemic inflammation contributing to a hindered ability to adapt to a  
427 training stimulus.

428 While the CON group experienced no changes in biomarkers indicative of muscular  
429 anabolism, OC users displayed a large increase in GH accompanied by a concomitant moderate  
430 decrease in IGF-1 from pre- to post-season. Moreover, AUC comparisons revealed ~1.5x greater  
431 exposure to GH in the OC group than the CON group throughout the season. This is in  
432 agreement with previous findings in female endurance athletes, in which increased GH levels  
433 without changes in IGF-1 were observed following OC treatment (42). Similar declines in IGF-1  
434 have been observed in ovarian suppressed female athletes with intense training, with declines  
435 becoming more pronounced over the 12-weeks of training, indicating a potentially increased  
436 catabolic environment in these athletes (48). The decreased IGF-1 levels observed over the  
437 season in OC users may indicate an impaired ability to induce muscular adaptations in these  
438 athletes (29).

439 Overall, CK levels in the CON group started and remained elevated above OC users,  
440 yielding about a ~3x greater exposure in the CON group throughout the season. Previous  
441 research has shown E<sub>2</sub> to potentially play a protective role against muscle damage through  
442 mechanisms such as increased membrane stabilization (46). Findings on acute elevations in CK  
443 post-exercise with OC use remain equivocal (47); however, greater reductions in CK values 72-  
444 hours post-exercise have been observed in OC users (11). The greater CK levels observed in the  
445 CON group may be indicative of greater skeletal muscle turnover in these athletes (3), especially  
446 when taken into context with the FFM gains over the competitive season.

447 Overall, linear trends for decreases in Fer and Fe and increases in TIBC and transferrin  
448 were shown in the players over the soccer season. Additionally, a small decrease occurred

449 through week 12 for %SAT followed by a small increase during the remainder of the season.  
450 These changes may indicate a trend towards a training-induced Fe deficiency particularly over  
451 the first 12-weeks of the season before the final decline in TL/EEE<sub>REL</sub> as observed in previous  
452 research (51). Fe deficiency, defined as Fer concentrations <12 µg/L and percent saturation  
453 <16%, has been reported in endurance and team sport athletes, with females experiencing a  
454 greater risk for reduced Fe status (30). The similar responses between groups in iron status over  
455 the collegiate season reflect previous findings that Fer and Fe concentrations are not affected  
456 with OC use (47).

457 For all athletes, FT<sub>3</sub> levels increased from baseline through week 12 before declining  
458 through week 15, demonstrating a similar response to that previously described in female  
459 collegiate soccer players (51). Decreased or no change in FT<sub>3</sub> levels have often been shown over  
460 training periods in athletes, potentially as an effort to promote energy conservation during high  
461 EEE (4, 48). Perhaps the FT<sub>3</sub> decline observed indicates decreased muscular metabolism “needs”  
462 as FT<sub>3</sub> regulates skeletal muscle metabolism (45) and these declines corresponded to further  
463 decreases in TL/EEE<sub>REL</sub> in weeks 12-15. Future research examining the relationship between  
464 changes in TL, EEE, and energy intake along with thyroid hormone responses in female athletes  
465 is warranted due to the conflicted findings in these hormones over periods of intense training.  
466 Between groups, OC athletes had considerably greater TSH, TT<sub>4</sub>, and TT<sub>3</sub> levels, yet no  
467 differences were observed for FT<sub>3</sub> exposure compared to CON players. It appears that OCs  
468 potentially influence thyroid hormone levels; however, this does not necessarily correspond to  
469 increased levels of the biologically active FT<sub>3</sub> above non-OC users. This lends support to  
470 previous findings that OCs may increase TSH as well as TT<sub>4</sub> and TT<sub>3</sub> levels due to increased

471 binding capacity of thyroxine-binding globulin, without significant changes in FT<sub>4</sub> and FT<sub>3</sub>  
472 levels (53).

473 For both groups, moderate to large increases were observed in leptin, an adipose-derived  
474 hormone whose levels are reflective of changes in energy balance (1), over the season.  
475 Previously in collegiate rowers, changes in FT<sub>3</sub> levels were related to leptin changes, with rowers  
476 experiencing either a decrease in both FT<sub>3</sub> and leptin or no change in the hormones over 20-  
477 weeks of training (4). Conversely, in this study increases in FT<sub>3</sub> and leptin were observed. It  
478 appears a relationship exists between thyroid hormones and leptin production that may be  
479 reflective of energy balance in athletes. Throughout the season OC athletes exhibited an almost  
480 ~1.5x greater exposure to leptin compared to CON. The elevated leptin levels correspond with  
481 the divergent results in BF% identified, with OC athletes maintaining values and the evidence  
482 obtained that CON progressively decreased values throughout the season. Leptin expression has  
483 been shown to correlate with adipose stores (1), supporting the disparity in leptin levels observed  
484 at baseline and throughout the season between the groups. Previous research examining the  
485 effects of OC use on body composition is inconsistent in its findings, with some studies reporting  
486 no change (40, 41), while others reporting increases in body weight (9, 12, 41). It appears  
487 however, that changes in leptin across a training block may occur independent of body  
488 composition changes, as previously evidenced in collegiate rowers (4). The authors speculate  
489 that while leptin may indicate fat storage, changes may be primarily influenced by fluctuations in  
490 energy balance (1) with training.

491 Team performance characteristics demonstrated the power-endurance nature of the sport  
492 with similar average team aerobic capacity and greater CMJ<sub>HOH</sub> ability as those previously  
493 reported in DI female soccer players (49). Additionally in female collegiate soccer athletes, body



494 composition changes and biomarker perturbations across a competitive season have been shown  
495 to occur alongside performance changes pre- to post-season (51). Specifically, changes in IL-6,  
496 IGF-1, GH, and TCORT have been shown to correlate to changes in body composition and  
497 performance metrics across a collegiate season (33). Although statistical comparison of  
498 performance changes between groups was not possible in this study due to reduced sample size  
499 at post-season testing; visual inspection of the data appears to show no discernable differences in  
500 aerobic performance metrics between groups pre- to post-season. In terms of power, it seems  
501 players in the CON group tended to experience increases in CMJ<sub>HOH</sub> across the season (n=8),  
502 while the OC group tended to maintain baseline values (n=4). Future research investigating the  
503 effects of OC use on long-term changes in athletic performance in a larger sample size is  
504 warranted in light of the increased catabolic and inflammatory environment that exists in OC  
505 athletes.

506 As previously noted, this study is not without its limitations. Although only one team was  
507 examined in this study yielding a small sample size, this also allowed for OC and CON athletes  
508 to partake in the same prescribed training throughout the entire 15-weeks of the season, in the  
509 same environment, with the same training system, and with the same coaching and monitoring  
510 strategies. The substantially different exposure to stress, inflammatory, and metabolic  
511 biomarkers between OC and CON groups across the season indicate a difference in physiological  
512 response, despite the sample size. Future research investigating the long-term effects of OC use  
513 on biomarker responses, body composition, and performance metrics across multiple teams and  
514 sports is warranted to corroborate these findings. Additionally, dose and type of OC was not  
515 controlled for in this study; however, the concentrations of reproductive hormones observed in  
516 the OC group reflected the typical reproductive hormonal profile associated with OC use (43).

517 As a variety of OC prescriptions currently exist, further research examining the effect of  
518 different OC formulations on female athletes is potentially needed. Finally, the timing of blood  
519 draws in this study may have influenced the observed reproductive hormone concentrations in  
520 the CON group due to cyclic nature of fluctuations in sex hormones during a typical menstrual  
521 cycle. Although the timing of blood draws was established in relation to seasonal demands,  
522 consistent differences were observed in circulating sex hormones through the season between  
523 players with and without OC use.

## 524

## 525 **6. CONCLUSION**

526 Overall, the TL and  $EEE_{REL}$  incurred during a NCAA DI soccer season corresponded to  
527 perturbations in biomarkers of stress, inflammation, hematologic status, metabolism, anabolism,  
528 and reproduction as well as changes in body composition. The majority of biomarker response  
529 patterns were similar between groups; however, large differences in biomarker exposures existed  
530 over the season. Specifically, OC use was related to exacerbated stress, inflammatory, and  
531 metabolic disruptions that corresponded to a potentially reduced capacity for training adaptations  
532 and recovery. This study highlights the need for further research examining the impact of OCs on  
533 changes in performance with training as well as to investigate the effect of other hormonal  
534 contraceptive methods on biomarkers and body composition changes.

## 535

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540 for publication.

541 **Conflicts of Interest:** The authors have no conflicts of interest to report.

542

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## Figure Legends

### Fig 1:

EEE<sub>REL</sub>: relative exercise energy expenditure; Plots illustrate smoothed data obtained from Bayesian hierarchical generalized linear models. Circles represent averages and error bars represent  $\pm$  standard deviations.

### Fig 2:

Plots illustrate smoothed data obtained from Bayesian hierarchical generalized linear models. Circles represent averages and error bars represent  $\pm$  standard deviations.