

**Early warning of footpad dermatitis and hockburn in broiler chicken flocks using optical flow, body weight and water consumption**

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Abstract:	Footpad dermatitis and hockburn are serious welfare and economic issues for the production of broiler (meat) chickens. We here describe the use of an inexpensive camera system that monitors the movements of broiler flocks throughout their lives and suggests that is possible to predict, even in young birds, the cross-sectional prevalence at slaughter of footpad dermatitis and hockburn before external signs are visible. The skew and kurtosis calculated from our camera-based optical flow system had considerably more power to predict these outcomes in the 50 flocks reported here than water consumption, body weight or mortality and therefore have the potential to inform improved flock management through giving farmers early warning of welfare issues. Further trials are underway to establish the generality of the results.

## ABSTRACT

Footpad dermatitis and hockburn are serious welfare and economic issues for the production of broiler (meat) chickens. We here describe the use of an inexpensive camera system that monitors the movements of broiler flocks throughout their lives and **suggests that is possible** to predict, even in young birds, the cross-sectional prevalence at slaughter of footpad dermatitis and hockburn before external signs are visible. The skew and kurtosis calculated from our camera-based optical flow system **had** considerably more power to predict these outcomes in the 50 flocks reported here than water consumption, body weight or mortality and therefore have the potential to inform improved flock management through giving farmers early warning of welfare issues. **Further trials are underway to establish the generality of the results.**

## INTRODUCTION

Footpad dermatitis (ulcerated lesions of the pad of the foot) and hockburn (discoloration and lesions of the hocks) are serious welfare and economic issues in the production of broiler (meat) chickens (Bessei 2006, Haslam and others 2007, Meluzzi and others 2008, Shepherd and Fairchild 2010, de Jong and others 2012, Kyvsgaard and others 2013, Elson 2015) but currently, there are few reliable ways of easily assessing these while the birds are still alive and interventions are still possible. Chickens reared for meat frequently live for only 33-42 days and as measures of welfare, producers use either *post-mortem* measures of the cross-sectional prevalence of footpad dermatitis, hockburn and breast blisters recorded at slaughter (SCAHAW 2000, Haslam and others, 2007, Allain and others 2009, Hepworth and others 2010) or labour-intensive methods such as manually sampling birds (Ekstrand and others 1998, de Jong and others 2012, de Jong and others 2016) that give only a snapshot of the state of a flock at a particular time.

Average body weight of birds at 14 days of age has been suggested as a possible indicator of flocks at high risk of later developing a high prevalence of hockburn (Hepworth and others 2010, 2011). The amount of water consumed by the growing birds is also widely recommended as means of assessing welfare (RSPCA 2013, Defra 2013, Red Tractor Assurance 2014, OIE 2016), since both increases and decreases in water consumption can indicate health problems (Butcher and others 1999). However, although the total amount of water consumed over the lifetime of a flock is positively correlated with the prevalence of footpad dermatitis assessed at the slaughter plant (Manning and others 2007), day-to-day changes in estimated water consumption do not appear to be particularly accurate as a welfare indicator (Manning and others 2007) because such changes can be caused by many factors such as leakages, inaccuracy of meters, variation in temperature, drinker type, ventilation rate, the mineral content of the water and diet (SCAHAW 2000, Lott and others 2003).

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3 In this paper, we compare the usefulness of both body weight and water  
4 consumption with that of an alternative automated welfare assessment system that  
5 monitors the behaviour of chicken flocks using 'optical flow' data derived from  
6 inexpensive cameras (Dawkins and others, 2009; Dawkins and others 2012). **Optical**  
7 **flow yields measures of behaviour at flock rather than individual level, such as**  
8 **overall levels of flock activity and whether the flock is behaving uniformly or is**  
9 **showing unusual behaviour (Dawkins and others, 2013).** Changes in behaviour are  
10 increasingly recognized as precursors of clinical signs of disease or other problems  
11 (Toscano and others 2010, Lee and others 2011) **so that changes in optical flow have**  
12 **the potential to give early warning of disease at the very earliest stages. For**  
13 **example,** optical flow patterns observed in chicken flocks as young as three days old  
14 have already been shown to predict hockburn prevalence at slaughter (Roberts and  
15 others 2012). Similarly, optical flow patterns in chicken flocks of less than seven days  
16 old have been shown to predict *Campylobacter* prevalence at slaughter (Colles and  
17 others 2016). Needing only simple cameras, optical flow analysis measures the rate  
18 of change over time of brightness within different parts of a moving visual image  
19 (Beauchemin and Barron 1995, Fleet and Weiss 2005) and thus provides information  
20 about tens or hundreds of individuals at once. **Using a sample of 50 commercial**  
21 **broiler flocks,** we show that optical flow can **potentially** provide farmers with an  
22 inexpensive and easy-to-use early warning system for flocks at increased risk of  
23 developing footpad dermatitis and hockburn.  
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## 29 METHODS

### 30 Flocks and housing

31 The aim of the project was to obtain **optical flow, production, water use and**  
32 **welfare records** from commercial flocks of broiler chickens and to cover all seasons  
33 of the year. **Since differences between companies, farms, time of year and**  
34 **management practices are known to have major effects on the health and welfare of**  
35 **birds (Dawkins and others, 2004), the study was designed to minimize the effects of**  
36 **these potentially confounding variables by using 50 flocks from a single farm, and**  
37 **thus standardizing the flocks as far as possible, including having the same farm**  
38 **manager throughout, the same set breeder farms from which the chicks were**  
39 **derived and the same slaughterhouse.** The farm chosen had 6 identical houses. 24  
40 flocks (i.e. 4 successive crops from the 6 houses) were studied between October  
41 2010 and June 2011. A further 29 flocks were studied between May 2014 and  
42 January 2015. Due to camera failure, optical flow records were obtained from only  
43 50 flocks.  
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48 The six identical houses had metal sides and a floor area of 1670 m<sup>2</sup>. Each  
49 house contained 488 feed pans and 1735 water nipples. Ventilation was standard  
50 roof extraction and the houses had windows and perches. Chicks were placed 'as  
51 hatched' (mixed sex) as day-olds (33,000-35,000 per house) and grown to 33-35 days  
52 of age **with a target stocking density of 34 kg/m<sup>2</sup>. In some cases, early removal of a**  
53 **proportion of birds ('thinning') occurred but this was unpredictable in both timing**  
54 **and proportion of the flock removed (both these factors were dependent on growth**  
55 **rate and supermarket demand). To avoid the disruption caused by thinning (de Jong**  
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3 and others, 2012), optical flow data were collected only up until 30 days of age,  
4 before thinning occurred in any of the flocks.  
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#### 6 7 **Hockburn and footpad dermatitis**

8 Slaughterhouse measurements of hockburn and footpad dermatitis are used  
9 by producers to set targets for the health and welfare of flocks. The outcome  
10 measures used in this study were therefore the same as those used by the farmers  
11 themselves – namely data on hockburn and footpad dermatitis on each flock  
12 collected by the producer company at slaughter following routine producer  
13 procedures. These were recorded as the cross-sectional prevalence of any signs of  
14 hockburn or footpad dermatitis, expressed as % of that flock.  
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#### 16 17 **Estimated water consumption**

18 Estimated daily water consumption was routinely recorded from house-specific  
19 meters by the farm staff and converted to consumption in litres/1000 birds. The data  
20 were recorded by the farm staff on flock sheets in each house.  
21

#### 22 23 **Body weight and daily mortality**

24 Producers supplied daily measurements of bird weights and cumulative mortality  
25 (dead plus all culls) for each flock as part of their own routine monitoring. Chickens  
26 were routinely weighed by fully automated electronic scales linked to a Fancom  
27 FWBU.e agricomputer (<http://www.fancom.com/en/broilers/biometrics>).  
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#### 29 30 **Cameras and recording equipment**

31 Flock behaviour was recorded using custom-built C120 web cameras,  
32 connected (two cameras/unit) to a small form-factor industrial PC (Fit-PC2, Anders  
33 Electronics plc, London, U.K.) enclosed in a protective waterproof housing. In each  
34 house, two units (four cameras) were installed, one on each side of a house at a  
35 height of 2.0 +/- 0.1 metres and pointing towards the ground at an angle of 70°.  
36 Cameras were positioned so that the field of view contained less than 10% of static  
37 objects such as feeders, drinkers, house uprights and connected to a mains power  
38 supply. To avoid disturbing the chicks, cameras were installed before the chicks  
39 arrived. To avoid possible disturbance caused by thinning (removal of a portion of  
40 the flock), data were collected for days 1-30 only (before any thinning occurred).  
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#### 43 44 **Optical flow**

45 Optical flow analysis involves detecting the rate of change of brightness  
46 within different areas of a moving visual image both temporally and spatially. These  
47 changes are combined to give an estimate of local velocity vectors (Beauchemin and  
48 Barron 1995, Fleet and Weiss 2005). Each image frame on a video file was divided  
49 into 320 x 240 pixel images grouped into 1200 (i.e. 40 x 30) 8-by-8 pixel blocks and  
50 optical flow statistics (mean, variance, skew, kurtosis) were calculated following  
51 methods described in (Dawkins and others 2012, Roberts and others 2012), at 4Hz  
52 between 08.00 and 20.00, when the lights were on. For each flock daily means for  
53 each statistic were calculated for days 1-30.  
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#### 56 57 **Statistical analysis** 58 59 60

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3 The cross-sectional prevalence of hockburn and footpad dermatitis were  
4 analysed using multivariable linear regression models. Logistic regression models  
5 could not be fitted to the estimated prevalence data because the sample size (n)  
6 used at the slaughter plant to estimate the prevalence was **not recorded**.  
7

8 For each day's data, all possible univariable and multivariable linear  
9 regression models were fitted to the data with between 1 and 7 of the potential  
10 predictors. For each day, the best of these models was selected on the basis that it  
11 maximized the adjusted R<sup>2</sup> statistic. Once this model had been chosen, it was refitted  
12 to data from flocks with complete data for the model predictors (not just those  
13 flocks with complete data for all seven predictors for that day), non-significant  
14 predictors (p>0.05) were dropped and the reduced model refitted until all of the  
15 remaining predictors were significant.  
16

17 We analysed data up to 15 days of age to investigate the basis for an early  
18 warning system for farmers. Some data were missing due to cameras not working.  
19 Data from days 1, 2 and 3 were not analysed because only 8 flocks had optical flow  
20 data from day 1, only 36 flocks had data from day 2 and only 38 flocks and flocks had  
21 data from day 3. The number of flocks (observations) used for the analysis is shown  
22 in Tables 1 and 2.  
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## 27 RESULTS

28 The mean prevalence of footpad dermatitis in the 53 flocks was 51.6%  
29 (standard deviation 23.4) and of hockburn 20.5% (standard deviation 16.4%). There  
30 was a positive correlation between footpad dermatitis and hockburn (Pearson  
31 r=0.53, n=50, p<0.01). Mean cumulative mortality to 30 days was 3.4% (standard  
32 deviation 1.07). Mean 30-day body weight was 1.6 kg (standard deviation 0.09).  
33 Data and number of flocks recorded for each age for daily means for water  
34 consumption, body weight, cumulative mortality and the four optical flow variables  
35 (mean, variance, skew and kurtosis) are given in Supplementary Information Table  
36 S1.  
37

38 The best adjusted R<sup>2</sup> models for the prevalence of footpad dermatitis and  
39 hockburn are shown by age in Tables 1 and 2 respectively. The data at 4 days of age  
40 produced the best models (in terms of adjusted R<sup>2</sup>) for both footpad dermatitis and  
41 hockburn. Table 3 and Figure 1a show the best fit linear regression model for the  
42 prevalence of footpad dermatitis, i.e. it includes only those predictors (out of the  
43 possible 7) that reached significance at p<0.05. This shows that as early as day 4 of  
44 life both skew and kurtosis of optical flow are highly significant predictors of future  
45 (as measured at slaughter) footpad damage. Estimated water consumption and  
46 body weight did not reach significance as predictors in the multivariable model for 4  
47 days of age, nor did the mean or variance of optical flow. Table 4 and Figure 1b show  
48 the corresponding best fit linear regression model for the prevalence of hockburn.  
49 The importance of optical flow predictors is again apparent: body weight, estimated  
50 water consumption and cumulative mortality appear as part of the highest adjusted  
51 R<sup>2</sup> model, but did not reach significance as predictors in the multivariable model for  
52 4 days of age.  
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## 57 DISCUSSION

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3 A particular strength of this study is the objective manner in which the  
4 predictors (estimated water consumption, body weight, cumulative mortality as well  
5 as optical flow) were collected prospectively, that is before the levels of hockburn  
6 and footpad dermatitis had been determined. Furthermore, the assessments of  
7 hockburn and footpad dermatitis were made using routine company practices,  
8 avoiding biases that could arise due to bespoke study-specific methods of  
9 assessment. Optical flow data were collected from standard camera positions but  
10 not analysed until after the flocks had been cleared.

11  
12 Hockburn and footpad dermatitis were correlated here as has been found  
13 previously (Haslam and others 2007). Both conditions have a genetic component  
14 (Bizeray and others 2000, Haslam and others 2007, Shepherd and Fairchild 2010,  
15 Ask, 2010) and are also affected by environmental factors, particularly poor quality  
16 litter (Eichner and others 2007, Haslam and others 2007, Martins and others 2013).

17  
18 Chicken flocks where some individuals have hockburn or footpad dermatitis  
19 can be seen as 'mixed ability' flocks – that is, they contain a mixture of birds with  
20 healthy and unhealthy legs and feet. Optical flow analysis of the movements of such  
21 flocks detects this as changes in both the skew and kurtosis of flock movement, in  
22 comparison with healthier flocks, which are more homogeneously healthy and more  
23 uniform in their movement. The skew and kurtosis of optical flow were, together,  
24 highly predictive of footpad dermatitis and hockburn at slaughter, but each detected  
25 a different measure of the heterogeneity in the movement of a flock. The skew  
26 values reported here (range 1.0 to 6.7, Figure 1) suggests that there are some flocks  
27 with an increase in asymmetry in the movement distribution, indicating a flock in  
28 which the commonest kind of movement (the mode) is displaced from the mean or  
29 average movement.

30  
31 The kurtosis describes a different feature of the flock behaviour, which is the  
32 extent to which the balance between the centre and the 'tails' of the distribution  
33 deviate from what is expected in a normal population. The high kurtosis reported  
34 here for some flocks implies that there is a deviation in the direction of 'fat tails' – in  
35 other words, an unusually high number of birds moving very much faster or slower  
36 than the mean. Although it seems counter-intuitive to say that the presence of a few  
37 fast moving birds is a sign of an 'at risk' or poor welfare flock, the flock that is in real  
38 trouble is the one where fast movement has become relatively rare. Healthy flocks  
39 have uniformly high levels movement, with few outliers and therefore low kurtosis.

40  
41 Lower skew (for a given level of kurtosis) and higher kurtosis (for a given level  
42 of skew) are thus indicative of heterogeneity in flock movement that is predictive of  
43 two key welfare outcomes, footpad dermatitis and hockburn. Optical flow can thus  
44 provide early warning of these key welfare issues, enabling farmers to make  
45 interventions (such as extra litter) to prevent symptoms becoming more serious.

46  
47 However, it is still not clear exactly how the correlations between optical  
48 flow, hockburn and pododermatitis arise (Dawkins and others, 2013). One possible  
49 connection could be that flocks with a tendency to sit for long periods of time spend  
50 more time with their legs in contact with litter and so are more likely to develop  
51 hockburn. But other routes, such as infections that make the birds both less active  
52 and more prone to gut disorders that then lead to poorer quality litter that in turn  
53 affects their legs and feet also need to be investigated.



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3 The best fit multivariable linear regression model showed that skew and  
4 kurtosis of optical flow had more predictive power than estimated water  
5 consumption, body weight or cumulative mortality, thus confirming the value of  
6 optical flow as a flock management tool.  
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8 The next step will be to repeat similar studies in additional farms, in  
9 particular those run by other companies to explore the generality of the results.  
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### 11 **ETHICS**

12 This study used broiler flocks that were reared commercially by industry  
13 partners, in line with standard industry practice. We performed non-invasive,  
14 non-intrusive camera observations of birds, and thus the need for approval  
15 under the Animals (Scientific Procedures) Act of 1986 was waived. All prevailing  
16 local, national and international regulations and conventions, and normal  
17 scientific ethical practices have been respected.  
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22 Council (grant no. BB/K001388). We are very grateful for in-kind support from Cargill  
23 Meats (Europe) and would like to thank Andrew Morris for his essential help with  
24 this project.  
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### 27 **CONTRIBUTIONS**

28 MSD designed and organized the study, collated the results and drafted the  
29 paper. SJR and TN developed the optical flow algorithms and RJC ran the trials and  
30 drew the figures. CAD performed the statistical analysis.  
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Table 1. Best adjusted R<sup>2</sup> models for each age of birds as predictors of footpad dermatitis prevalence.

Age (days)	Obs. used	Best adjusted R <sup>2</sup>	Model
1	(8)		
2	(36)		
3	(38)		
<b>4</b>	<b>43</b>	<b>31.8%</b>	<b>Water4 Weight4 CumulMort4 OFVar4 OFSkew4 OFKurt4</b>
5	43	24.3%	Water5 CumulMort5 OFVar5 OFSkew5 OFKurt5
6	45	23.6%	Water6 CumulMort6 OFMean6 OFSkew6 OFKurt6
7	45	30.7%	Water7 CumulMort7 OFSkew7 OFKurt7
8	47	21.9%	Water8 CumulMort8 OFVar8 OFSkew8 OFKurt8
9	47	21.2%	Water9 CumulMort9 OFVar9 OFSkew9 OFKurt9
10	48	20.7%	Water10 CumulMort10 OFVar10 OFSkew10 OFKurt10
11	50	17.9%	Water11 CumulMort11 OFVar11 OFSkew11 OFKurt11
12	49	16.6%	Water12 CumulMort12 OFVar12 OFSkew12 OFKurt12
13	49	16.4%	CumulMort13 OFSkew13 OFKurt13
14	49	21.7%	CumulMort14 OFSkew14 OFKurt14
15	49	19.3%	Water15 OFVar15

The variable names are: estimated water consumption (Water), average weight (Weight), cumulative mortality (CumulMort), and optical flow statistics: mean (OFMean), variance (OFVar), skew (OFSkew) and kurtosis (OFKurtosis). The number at the end of the name reflects the age in days to which each predictor related.

Table 2. Best adjusted  $R^2$  models for each age of birds as predictors of hockburn prevalence. (Variable names as in Table 1.)

Age (days)	Obs. used	Best adjusted $R^2$	Model
1	(8)		
2	(36)		
3	(38)		
<b>4</b>	<b>43</b>	<b>29.8%</b>	<b>OFMean4 OFSkew4 OFKurt4</b>
5	43	23.8%	OFSkew5 OFKurt5
6	45	27.6%	Weight6 OFSkew6 OFKurt6
7	45	22.7%	Weight7 OFMean7 OFVar7 OFSkew7 OFKurt7
8	47	24.3%	Weight8 OFMean8 OFVar8 OFSkew8 OFKurt8
9	47	21.0%	Weight9 OFSkew9 OFKurt9
10	48	21.2%	Weight10 OFSkew10 OFKurt10
11	50	25.3%	Weight11 OFMean11 OFVar11 OFSkew11 OFKurt11
12	49	25.2%	Weight12 OFMean12 OFSkew12 OFKurt12
13	49	25.7%	Weight13 OFMean13 OFVar13 OFSkew13 OFKurt13
14	49	29.0%	Weight14 OFMean14 OFSkew14 OFKurt14
15	49	25.6%	Weight15 OFSkew15 OFKurt15

Table 3. Parameter estimates for the best fit multivariable linear regression model for the prevalence of footpad dermatitis. (Variable names as in Table 1.)

Adjusted  $R^2 = 23.0\%$ ;  $n=44$ . If fixed effects are added for the 6 houses, the estimates are very similar: OFSkew4: -31.14, SE=9.79,  $t=-3.18$ ,  $p=0.0030$ ; OFKurtosis4: 2.75, SE= 0.83,  $t=3.32$ ,  $p=0.0021$ .

Variable	Estimate	SE	t	p
Intercept	94.58	14.78	6.40	<0.0001
OFSkew4	-31.88	8.46	-3.77	0.0005
OFKurtosis4	2.81	0.73	3.85	0.0004

Table 4. Parameter estimates for the best fit multivariable linear regression model for the prevalence of hockburn. (Variable names as in Table 1.)

Adjusted  $R^2 = 30.29\%$ ;  $n=44$ . If fixed effects are added for the 6 houses, the estimates are very similar: OFSkew4: -28.45, SE=7.31,  $t=-3.89$ ,  $p=0.004$ ; OFKurtosis4: 2.50, SE=0.62,  $t=4.04$ ,  $p=0.0003$ .

Variable	Estimate	SE	t value	p
Intercept	55.14	11.13	4.96	<0.0001
OFSkew4	-27.15	6.37	-4.26	0.0001
OFKurtosis4	2.45	0.55	4.42	<0.0001

Figure Captions

Figure 1 Plots of the best fit regression models for A) the prevalence of footpad dermatitis and B) the prevalence of hockburn as a function of the optical flow skew and kurtosis at 4 days of age (see Tables 3 and 4 for the parameter estimates). The observed data are overlaid over the regression model predictions.

Confidential: For Review Only

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FIGURE 1

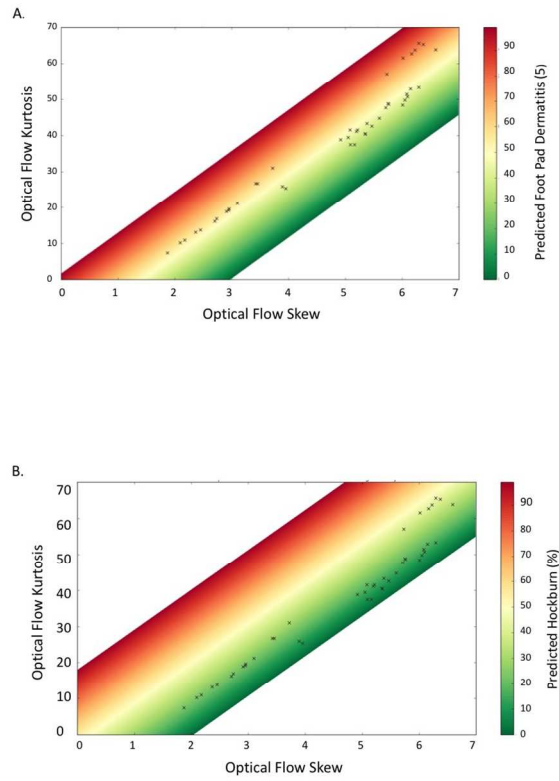


Figure 1 Plots of the best fit regression models for A) the prevalence of footpad dermatitis and B) the prevalence of hockburn as a function of the optical flow skew and kurtosis at 4 days of age (see Tables 3 and 4 for the parameter estimates). The observed data are overlaid over the regression model predictions

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