

# Estimating the likelihood of ESBL-producing E. coli carriage in slaughter-aged pigs following bacterial introduction onto a farm: A multiscale risk assessment

Catherine Mccarthy, Alexis Viel, Chris Gavin, Pascal Sanders, Robin R.L.

Simons

## ▶ To cite this version:

Catherine Mccarthy, Alexis Viel, Chris Gavin, Pascal Sanders, Robin R.L. Simons. Estimating the likelihood of ESBL-producing E. coli carriage in slaughter-aged pigs following bacterial introduction onto a farm: A multiscale risk assessment. Microbial Risk Analysis, 2022, 20, pp.100185. 10.1016/j.mran.2021.100185. anses-03441007

## HAL Id: anses-03441007 https://anses.hal.science/anses-03441007

Submitted on 15 Mar 2024

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés. 1 Estimating the likelihood of ESBL-producing *E. coli* carriage in

2 slaughter-aged pigs following bacterial introduction onto a farm: a

- 3 multiscale risk assessment
- 4
- 5 Catherine M<sup>c</sup>Carthy<sup>a\*</sup>, Alexis Viel<sup>b</sup>, Chris Gavin<sup>a</sup>, Pascal Sanders<sup>b</sup>, Robin R.L. Simons<sup>a</sup>
- <sup>a</sup> Department of Epidemiological Sciences, Animal and Plant Health Agency (APHA), Woodham Lane,
  New Haw, Addlestone, KT15 3NB
- 8 <sup>b</sup> French Agency for Food, Environmental and Occupational Health & Safety (Anses), Laboratoire de
- 9 Fougères, 35300 Fougères, France
- 10
- 11 \*Corresponding author: Catherine M<sup>c</sup>Carthy
- 12 Corresponding author address:
- 13 APHA Weybridge, New Haw, Addlestone, KT15 3NB, UK
- 14 +44 (0) 208 7203010
- 15 <u>Catherine.McCarthy@apha.gov.uk</u>
- 16
- 17 Short title: A risk assessment to predict the likelihood of ESBL-producing *E. coli* carriage on
- 18 commercial pig farms

#### 19 Abstract

20 The transmission of antimicrobial resistance (AMR) between animals, their environment, food and 21 humans is a complex issue. Previous pharmacokinetic-pharmacodynamic (PKPD) models indicate 22 that extended-spectrum  $\beta$ -lactamase (ESBL) resistant bacterial populations may be self-sustaining 23 through horizontal and vertical gene transfer, even in the absence of antimicrobial pressure. 24 However, models focusing purely on the biochemical aspects fail to incorporate the complicated 25 host population dynamics which occur within a farm environment. Models of disease transmission 26 within commercial farm environments can provide further insight to the on-farm transmission 27 dynamics of AMR between animals and their environment, as well as predict the effect of various 28 on-farm interventions. Here, we present a risk assessment which predicts the likelihood that 29 slaughter-aged pigs would carry resistant bacteria after a single introduction of ESBL E. coli on commercial pig farms. We incorporate outputs from a PKPD model which explores the complex 30 31 host/gastrointestinal bacteria interplay after antimicrobial treatment; with an on-farm model of 32 bacterial transmission. The risk assessment is designed to be adaptable for the simultaneous 33 transmission of multiple bacteria and resistant strains. We predicted that after introduction onto a 34 pig farm, ESBL E. coli bacteria are likely to persist on the farm for more than a year, leading to a high batch prevalence (39.4% slaughter pigs, 5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-57.5) and high faecal shedding. 35 A comparison of different farm management types suggested that all-in-all-out housing was a 36 37 protective measure for both prevalence in slaughter-aged pigs and faecal shedding rates. We applied 38 two main interventions at the farm level, an enhanced cleaning and disinfectant (C&D) protocol and 39 isolation of pigs in sick pens for the duration of their antibiotic treatment. Both interventions were able to reduce the number of pigs shedding more than 2 log<sub>10</sub> ESBL *E. coli* from 18.7% (5<sup>th</sup> and 95<sup>th</sup> 40 percentiles: 5.9-30.4) in the baseline scenario, to 7.2% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-21.5) when an 41 enhanced C&D protocol was applied, 0.1% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-0.3) when sick pens were 42 used and 0.1% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-0.3) when a combination of enhanced C&D plus sick 43 pens was used. Both scenarios also reduced the prevalence in batches of pigs going to slaughter. 44 45 This effect was largest when sick pens were used, where 75% of batches had 0% positive pigs. The 46 results suggest that a single introductory event is sufficient to cause a substantial risk of carriage in 47 slaughter-aged pigs. Further quantitative microbial risk assessments (QMRA) are needed to consider 48 the onwards risk posed to later parts of the food chain.

49

50 Keywords: antimicrobial resistance, pharmacokinetic-pharmacodynamic model, transmission model,

51 intervention, slaughter, farm management

#### 52 1 Introduction

The World Economic Forum has identified antimicrobial resistance (AMR) as a "global risk", stating that "while viruses may capture more headlines, arguably the greatest risk of hubris to human health comes in the form of antibiotic-resistant bacteria" (World Economic Forum, 2013). With no major new class of antibiotics having been discovered since 1987 (World Health Organization, 2015), there is the very real concern that bacterial diseases that are currently not life threatening may once again prove fatal.

59

ESBLs are predominantly plasmid-encoded enzymes found in Enterobacteriaceae which confer 60 61 resistance to a variety of beta-lactam antibiotics (EFSA, 2011). The first human clinical isolates 62 expressing ESBLs were identified in Germany in 1983 (Knothe et al., 1983; Kliebe et al., 1985) with 63 carriage in animals and meat products reported since 2000 (EFSA, 2011). ESBL-producing 64 Enterobacteriaceae may cause a range of clinical infections in people from urinary tract infections 65 (UTI) to more serious bloodstream infections (Pitout and Laupland, 2008). They have also been 66 involved in serious large scale antimicrobial resistant bacterial disease outbreaks in hospital settings 67 (NethMap, 2019). However, it is not only the direct transmission of pathogenic bacteria that is a 68 concern, but also the transmission of non-pathogenic AMR bacteria, such as commensal E. coli, 69 which could potentially colonise the human gastrointestinal tract (GIT) and then confer resistance to 70 pathogenic bacteria ingested subsequently.

71

72 There is ongoing debate as to the contribution that the food chain plays with regards to the 73 transmission and spread of AMR bacteria in humans. This is likely to vary widely by bacterial species, 74 transmission routes, and other factors. For example, the majority of human extended-spectrum beta 75 (β)-lactamase producing *E. coli* (hereafter, ESBL *E. coli*) carriage, is acquired from other humans 76 (Mughini-Gras et al., 2019). Recent studies indicate that the attribution from the open population 77 (defined as clinically healthy individuals who had not travelled to high-risk regions nor engaged in 78 farming activities) may be as high as 60.1% (Mughini-Gras et al., 2019). However, it is accepted that 79 humans can acquire zoonotic pathogens such as Salmonella and shiga toxin-producing Escherichia 80 coli (STEC) from consumption of meat (EFSA, 2019) and the World Health Organisation argues that 81 food is one of the possible transmission routes of AMR from animals to humans (World Health 82 Organization, 2015). In the same recent modelling study, food consumption (meat, seafood and 83 vegetables) accounted for 18.9% of human ESBL carriage cases (Mughini-Gras et al., 2019). In the 84 United Kingdom, 4.7% of pork products tested at retail were positive for ESBL/AmpC E. coli, whereas 85 2.5% of Campylobacter spp. isolates from retail chicken meat displayed multi-drug resistance profiles (Willis et al., 2018). It is therefore prudent to consider how to limit the acquisition of 86 87 antimicrobial resistant bacteria via the food chain. It is recognised that the livestock industry may 88 play a large role in dissemination of AMR through both direct occupational and non-occupational 89 contact with farm animals (Mughini-Gras et al., 2019), and indirect methods such as the 90 dissemination of antibiotics into the environment (World Health Organization, 2015; Casey L. Cazer 91 et al., 2017; Filippitzi et al., 2019). The need to control resistant bacteria in the livestock industry, 92 both in order to reduce onwards transmission to humans, and to maintain treatment options for 93 animals, has been well documented in the literature.

Many generic models have previously been developed to investigate the transmission of AMR at the 95 96 bacterial level from donor bacteria to recipient bacteria. These models indicate that resistant 97 bacterial populations can persist in the absence of antimicrobial pressure, through horizontal and 98 vertical gene transfer (Freter et al., 1983; Bergstrom et al., 2000; Volkova et al., 2012). However, 99 models focusing purely on the biochemical, within-host aspects fail to incorporate the complicated 100 host population dynamics which occur within a farm environment. For example, heterogeneous 101 animal mixing and ingestion habits, the movement of animals within and between farms, cleaning 102 and disinfection protocols, and treatment of animals for a multitude of farm pathogens, may all 103 impact on the persistence of a population of endemic bacteria. Moreover, biochemical bacterial 104 growth studies often use broths or growth mediums which replicate ideal growth conditions and can 105 have quite different results to growth within faeces in a farm environment. A previous mathematical 106 model comparing the impact of antimicrobial usage with the emergence of resistant bacteria in 107 finisher pig farms found that both the transmission coefficient between pigs and the spontaneous 108 clearance rate of drug-resistant bacteria influenced whether the resistant bacteria reached a steady 109 endemic state on the farm or whether the bacteria could be cleared from the farm (Abatih et al., 110 2009). The combination of pharmacokinetic-pharmacodynamic (PKPD) models with on-farm models 111 of bacterial transmission and realistic farm management practices, would offer a unique opportunity 112 to understand the disease dynamics in a more realistic environment.

113

114 The evidence regarding the presence, prevalence and microbial load of AMR bacteria in slaughter-115 age animals is limited. It is therefore imperative to gain further insight into on-farm AMR 116 transmission dynamics with a view to assessing the level of resistance in slaughter-age animals and 117 the impact of potential control measures. This risk assessment aims to predict the likelihood of 118 resistant bacterial carriage in slaughter-aged pigs following a single introduction of ESBL E. coli onto 119 commercial pig farms. The prevalence and concentration in pigs is further explored through 120 scenarios designed to understand the effect of different, practical, on-farm interventions. Uniquely, 121 we show how outputs from PKPD models can be combined with farm transmission models to add 122 further confidence to a farm-based risk assessment. It is hoped that this will provide useful 123 information for further studies, such as a full farm-to-consumption QMRA and cost-benefit models.

#### 124 2 Methods

125 This risk assessment combined output from a PKPD model with a farm transmission model. The final 126 output was the prevalence and concentration of resistant bacteria in the faeces of pigs sent to the 127 abattoir. While the results are demonstrated using ESBL-producing commensal E. coli (hereafter, 128 ESBL E. coli) on commercial UK pig farms treated (or not) with amoxicillin (AMOX), it is designed to 129 be easily adapted for other bacteria and resistant strains, including multiple resistant strains, and 130 other antibiotics. The model tracked the ingestion, excretion and carriage of both sensitive and 131 resistant E. coli independently. An overview is provided here with full details available in appendix 1 132 and 2.

133

#### 134 2.1 PKPD model

The development of the within-host semi-mechanistic PKPD model (hereafter simplified as PKPD 135 model) was based on previous works in cattle from Cazer et al. (2017) and Volkova et al. (2017), and 136 adapted to pigs. The aim was to predict the impact of an antimicrobial treatment (as an input of the 137 138 model) on the selection of ESBL E. coli within the GIT and excretion towards faeces (output of the 139 model), at the individual and population level (taking into account the inter-individual variability). 140 The model was divided into a PK part describing the fate of AMOX within the GIT and a PD component to describe the level variations of sensitive E. coli and ESBL E. coli within the colon (and 141 142 towards faeces) (Figure 1).

143



144

- 145 Figure 1: Overview of pharmacokinetic-pharmacodynamic (PKPD) model for amoxicillin and E. coli within a pig
- 146 gastrointestinal tract (GIT). The PK submodel describes the PK of amoxicillin (AMOX) after intramuscular administration
- 147 within the central system and the digestive tract. The PD submodel describes the dynamics of sensitive and resistant E. coli
- 148 within the GIT and the impact of AMOX. (See Appendix 1 for more details).

A hybrid PK model was developed with empirical compartments for the central system (central and
 peripheral compartments) based on previous population PK studies of amoxicillin in pigs (Rey *et al.*,
 2014; Agersø and Friis, 1998) and more mechanistic compartments for the GIT (with physiological

volumes and transit rates) (see appendix A1.1 for equations and parameter distributions).

154

155 The PD model involves one sensitive and one resistant sub-population of E. coli (i.e. ESBL) within the 156 colon, the latter harbouring resistance genes within a plasmid. Note that the sensitive E. coli was 157 modelled here as a ubiquitous, commensal bacteria and not indicative of an independent E. coli 158 infection in the pigs. Each bacterial population grew following a logistic model until they reached the 159 (shared) maximal capacity of bacterial load within intestines, meaning that they compete for the 160 same ecological niche (nutrients, space, etc.) (Blanquart, 2019; Davies et al., 2019). Bacteria were 161 also affected by a natural death constant. Moreover, there was an inflow of bacteria from the environment (via feeding/coprophagia) and an outflow by faecal excretion. The AMOX 162 163 concentrations within the colon impacted the bacteria with an increase in the death of bacteria. 164 Finally, a transmission of plasmid from resistant to sensitive bacteria by conjugation process was also 165 considered as well as a potential plasmid loss by segregation (see appendix A1.2 for equations and 166 parameter distributions).

167

The considered scenario was a treatment with AMOX given by intramuscular injections once a day for five consecutive days at 15 mg/kg, in post-weaning pigs of 17 kg. The treatment started at t=50 hours (and ended at t=146 hours) with an integrative step of 3 hours. Different amounts of inflow of resistant bacteria (InflowR, see Appendix A1.2) were considered from t=0 hours until end of simulations: 2, 4, 6 or 8 log<sub>10</sub> cfu/g ESBL *E. coli* per day. The daily quantities of sensitive and resistant bacteria excreted towards faeces were outputs from the model used to connect with the farm transmission model (see section 2.3).

175

176 Monte Carlo simulations were performed, based on the distribution of each parameter, to generate 177 a population of 5000 pigs. All simulations were done in Rstudio (RStudio, 2018) with the simulX 178 function of the mlxR package from Lixoft (Lavielle, 2020).

179

#### 180 2.2 Farm transmission model

The farm transmission model was an individual based, stochastic, susceptible-infected-susceptible (SIS) model of pigs within commercial pig farms, where "infected" indicated that the pigs were colonised with resistant bacteria. It was based on a previous model of *Salmonella* transmission on commercial pig farms in the European Union (Hill *et al.*, 2016). The model consisted of two main components: a pig management and a bacterial transmission component (Figure 2). The model was run with 500 iterations, each iteration representing production from one farm over a 365-day period. The time step of the model was one day.





Figure 2: Overview of farm model which simulated the colonisation and transmission of resistant bacteria in pigs within a commercial farm environment. The model has both management and transmission components. The management component tracked individual pigs as they moved through the farrowing, weaner, grower and finisher stages. The transmission component simulated the build-up (and loss) of bacteria within the pen environment, ingestion of bacteria and subsequent colonisation and faecal excretion. Faecal excretion rates were calculated from the output from the PKPD model (Figure 1).

196 The farms were designed as breeder-finisher systems, where pigs stay on the same farm from birth until they go to the abattoir. The model incorporated different practices of commercial pig farms. 197 198 Farms may run an all-in-all-out (AIAO) production system (where batches of pigs were kept together 199 in one room for each of the weaning, growing and finishing stages, without direct contact with other 200 batches all the way through rearing), or a continuous production system which allows mixing of different batches of pigs at each stage of development. Farms could also use solid or slatted floor in 201 202 the pig pens. Different production systems were randomly selected for each iteration but the probability of selection was weighted towards that of the UK commercial pig industry, as in Hill et al. 203 204 (2016). Therefore, the majority of farms had a continuous system on solid floor (43.2%), followed by 205 an all-in-all-out (AIAO) system on solid floor (39.2%), continuous system on slatted floor (10.9%) and 206 AIAO on slatted floor (6.6%). The baseline model sums the predicted number of positive pigs over all batches/farms to estimate the prevalence of colonised pigs going to slaughter. Comparisons of the 207 208 relative risk in different farm types was also explored.

209

The management component tracked individual pigs as they moved through the farrowing, weaner, grower and finisher stages. Transport to slaughter occurred weekly when one batch of pigs (consisting of four pens of 40 finishers) leaves the farm. The first five batches of pigs sent to slaughter were excluded from analysis to allow sufficient introduction of bacteria to occur.

The transmission component simulated the build-up (and loss) of bacteria within the pen environment, ingestion of bacteria and subsequent colonisation and faecal excretion. Faecal excretion rates were calculated from the output from the PKPD model (see below). Bacterial levels in the environment could change due to the natural decay of the pathogen over time, loss through flooring (if slatted flooring is used) or cleaning and cross-contamination to or from neighbouring pens (see appendix A2 for equations and parameter distributions).

221

222 The model was initiated by simulating a single introductory event on day 0, in which five piglets started excreting 8 log<sub>10</sub> cfu/g ESBL E. coli (Hansen et al., 2013). The model randomly selected the 223 224 five piglets on each iteration. These could reside in any of the piglet pens and were not necessarily 225 within the same pen. Piglets were chosen as the group for this introduction event as these were 226 furthest in age from the finisher pigs, and so were the group least likely to still show carriage by 227 slaughter age (thereby simulating a "worst case" scenario). The consequence of choosing five piglets 228 was explored in the sensitivity analysis. Moreover, the baseline model randomly assigned five 229 colonised piglets to any piglet pen. We ran an additional piglet scenario to assess whether the 230 carriage of ESBL E. coli in slaughter-aged pigs was dependent upon the initial location of the 231 colonised piglets on day one. Specifically, we ran a scenario to see whether slaughter-aged pigs 232 could still carry ESBL E. coli if the five colonised piglets were initially within the same pen (therefore 233 simulating infection from one sow), or one colonised piglet was placed in five different pens 234 (therefore simulating a low-level excretion from five infected sows).

235

#### 236 2.3 Integrating the PKPD output with the farm transmission model

237 The PKPD model provided an estimate of the bacterial excretion rates from 5,000 pigs who ingested 238 either 2, 4, 6 or 8 log<sub>10</sub> cfu/g ESBL *E. coli* per day, both for pigs which were, and were not, treated 239 with AMOX. For pigs treated with AMOX, faecal excretion rates of resistant bacteria were shown to 240 peak one day after antimicrobial treatment ceased (day six), and then had a log linear decrease over 241 time. To calculate the maximum faecal excretion rate for each combination of ingestion and 242 antibiotic status, we fitted different models (linear, log linear, polynomial) to determine the best fit 243 for the percentiles of pigs on day six. The polynomial model proved the best fit. To calculate the daily rate decrease after the peak, we fitted a linear equation to the 50<sup>th</sup> percentile of pigs in the PKPD 244 245 model from the peak to the end of the simulation (again, allowing for ingestion and antibiotic 246 status).

247

It was assumed that there would be a variety of endemic diseases circulating on the pig farm, such as nervous system and respiratory diseases. On each day in the farm transmission model, healthy pigs had a probability of becoming "sick" with such a disease and being treated with antibiotics. Due to the predominance of these diseases in weaner age piglets and older (Merck, 2016), it was assumed that piglets wouldn't be classed as sick. Therefore, piglets (up until 28-days-old) were never treated with antibiotics. The youngest age at which pigs could be treated with antibiotics was in the weaner stage.

256 At each time step in the farm transmission model, the amount of ESBL E. coli ingested by each pig was calculated. The relevant outputs from the PKPD model were selected depending on the 257 258 ingestion value and whether the pig had or hadn't been treated with antibiotics. On the first day that 259 a pig ingested ESBL E. coli, we assigned a percentile to each pig by sampling from the uniform distribution set around the 10<sup>th</sup> and 90<sup>th</sup> percentiles for the dose ingested. Note that due to 260 uncertainty from the PKPD model, it was decided not to use more extreme percentiles (5<sup>th</sup> and 95<sup>th</sup>) 261 262 as it was not clear if these would be biologically plausible. This value was entered into the 263 polynomial equation to calculate the maximum faecal excretion rate of ESBL E. coli for that pig. On 264 subsequent days, the model determined whether the amount ingested had changed sufficiently 265 from the previous day (i.e. whether the new ingestion amount was at least 2 log<sub>10</sub> cfu/g higher or 266 lower than the previous day, such that the pig should enter a new ingestion category in the PKPD 267 output). If this was the case, then we resampled from the uniform distribution which was entered 268 into the new polynomial equation. If the ingestion category did not change, then we assumed that 269 the faecal excretion rate remained constant for six days. On subsequent days, (assuming no change 270 in ingestion category), the pig would decrease by the rate determined by the linear equation from 271 the 50<sup>th</sup> percentile of pigs.

272

#### 273 2.4 Scenarios for farm-based interventions

274 During the baseline model simulations, we assumed that pigs could be treated with antibiotics whilst 275 still residing within the pig pen that they were in prior to becoming classed as "sick". As an initial 276 exploration into whether isolation of sick pigs helped to reduce resistant bacteria transmission, we 277 simulated an additional intervention where sick pigs were moved out of the communal pen and into 278 a separated "sick pen" (the hypothesis being that pigs treated with antibiotics would have the 279 highest rate of excretion, which may reduce by the time they leave the sick pen). These pens were 280 modelled to occur in complete isolation, with no cross-contamination between pens. They were 281 cleaned weekly. There was one sick pen per age group and all sick pigs of the same age resided in 282 the same sick pen for the duration of time that they are treated with antibiotics. When pigs 283 completed their antibiotic treatment they were returned to their original batch and considered to be 284 healthy again, such that they could potentially become sick again and re-start antibacterial 285 treatment.

286

A further intervention was modelled to understand the effect of an enhanced cleaning and disinfection (C&D) protocol. Cleaning has been found to be less than 100% effective at eliminating *E. coli* within lairage pens, with up to 2.8 log<sub>10</sub> CFU/cm<sup>2</sup> remaining after cleaning (FSA, 2006). Parameters related to cleaning in the baseline model were taken from estimates used in the *Salmonella* model (Hill et al. 2015). The C&D scenario simulated a situation where enhanced cleaning was used, which removed all contamination after a cleaning event.

- 293
- 294
- 295

296

- 298
- 299

## 300 3 Results

Simulations using the PKPD model highlighted the impact of the AMOX treatment on the quantities of sensitive and resistant bacteria excreted towards faeces (Figure 3). Indeed, during the treatment period (from t=50 to t=146h), there was a huge increase of ESBL *E. coli* therefore resistant bacteria stayed at a dominant level at least 14 days after the end of treatment. The daily inflow of resistant bacteria was the major parameter influencing the level of excretion of resistant bacteria, for both treated and untreated pigs, and this was confirmed by the results of the sensitivity analysis (see appendix A3.1).



308

Figure 3: Outputs of the PKPD model for the quantity of sensitive E. coli and resistant (ESBL) E. coli for a simulated
population of 5000 pigs. Scenarios were simulated for different daily inflows of ESBL E. coli (levels indicated on right y axis),
with and without Amoxicillin treatment (indicated on top x axis). The median estimates are represented by the coloured
lines and the shaded areas indicate the 10th and 90th percentiles.

313

314 Results from the overall risk assessment suggested that after an introduction of ESBL E. coli into the piglet pens, bacteria would seed into the finisher pig pens and produce positive slaughter-aged pigs 315 316 (Figure 4). These levels would then remain high until the end of the simulation at 52 weeks. The average prevalence in batches of slaughter-aged pigs (defined as a group of 40 finisher pigs from 317 four pens going to slaughter at the same time) in the baseline scenario was 39.4% (5<sup>th</sup> and 95<sup>th</sup> 318 percentile: 0.0%-57.5%). However, there was variation between pens and iterations, with occasional 319 finisher buildings remaining negative in some iterations. The average pig prevalence within positive 320 batches was 46.3% (5<sup>th</sup> and 95<sup>th</sup> percentile: 4.4-58.1). 321





Figure 4: Prevalence of ESBL E. coli carriage in batches of slaughter–aged pigs within a commercial pig farm environment.
 Five colonised piglets were simulated to enter the farm on day 1. Slaughter-aged pigs were removed weekly from the farm.
 Results from the first five weeks have been removed from the analysis in order to allow full transmission within the farm
 (results shown for weeks 6 onwards). Shaded regions refer to the 5th and 95<sup>th</sup> percentiles from 500 iterations.

328 A comparison of different farm types suggested that AIAO housing was a protective measure for both prevalence in slaughter-aged pigs and faecal shedding rates. The average batch prevalence in 329 pigs raised in AIAO systems on slatted floor was 26.9% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-51.6), whereas 330 those on solid floor had a reduced average batch prevalence of 5.0% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-331 56.3) (Figure 5A). The prevalence was higher in continuous systems, where pigs reared on slatted 332 floor had an average prevalence of 34.4% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-52.5) and those raised on 333 solid floor had a prevalence of 48.1% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-59.4). Similarly, pigs raised in AIAO 334 systems had lower faecal shedding rates, with 13.0% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 6.9-15.2) on 335 336 slatted floor and 10.3% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 5.1-14.4) on solid floor shedding over 2 log<sub>10</sub> cfu/g (Figure 5B). In comparison, 22.0% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 20.1-23.8) on slatted floor and 337 26.4% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 18.5-30.9) on solid floor, raised in a continuous system, shed 338 over  $2 \log_{10} cfu/g$ . 339



340

Figure 5: Batch prevalence (A) and faecal shedding rates (B) for ESBL producing E. coli in slaughter – aged pigs reared in the
 following commercial farm management types: All-In-All-Out (AIAO) system on slatted floor (AIAO\_slatted), AIAO system on
 solid floor (AIAO\_solid), continuous system on slatted floor (continuous\_slatted) and continuous system on solid floor
 (continuous\_solid). In figure B, error bars show 5th and 95th confidence limits.

The scenario results suggested that both enhanced C&D and the use of sick pens acted to reduce the 346 prevalence in batches going to slaughter (Erreur ! Source du renvoi introuvable.A). The average 347 batch prevalence under the C&D scenario was reduced to 6.3% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-53.8). 348 The use of sick pens or sick pens plus C&D both reduced this further, to 0.0% (5<sup>th</sup> and 95<sup>th</sup> 349 percentiles: 0.0-44.4%) and 0.0% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-47.5%) respectively. Moreover, all 350 interventions acted to reduce the shedding rates in positive pigs (Erreur ! Source du renvoi 351 introuvable.B). In the baseline scenario, 69.8% (5<sup>th</sup> and 95<sup>th</sup> percentile: 52.5–90.0) of pigs were not 352 excreting ESBL E. coli at slaughter. Of those pigs that were positive, the majority (18.7%, 5<sup>th</sup> and 95<sup>th</sup> 353 percentiles: 5.9-30.4) shed over 2  $log_{10}$  cfu/g. In the C&D, sick pens, and sick pens plus C&D 354 scenarios, 7.2% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-21.5), 0.1% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-0.3) 355 and 0.1% pigs (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-0.3) respectively, shed over  $2 \log_{10} cfu/g$ . 356



357

Figure 6: Batch prevalence (A) and faecal shedding rates (B) for ESBL producing E. coli in slaughter – aged pigs within a
 commercial farm environment. The baseline model is compared against the following interventions: enhanced cleaning and
 disinfection (C&D), the use of sick pens to isolate pigs on antimicrobial treatment (Sick Pens), and a combination of sick pens
 plus enhanced C&D (Sick Pens + C&D). In figure B, error bars show 5th and 95th confidence limits.

Results from the sensitivity analysis suggested that the average prevalence at slaughter-age was most sensitive to the old faecal loss through the floor and the decay of bacteria within the pen environment. It was less sensitive to the proportion of pigs treated with antibiotics per day and the cross contamination rates between pens (Figure A3.2). The piglet scenario analysis showed that slaughter-aged pigs could carry resistant bacteria after a single introduction of ESBL *E. coli* on commercial pig farms even if five colonised piglets were placed within the same pen, or if one colonised piglet was placed in five different pens (see Figure A3.3).

- 371
- 372
- 373
- 374
- 375

#### 376 4 Discussion

377 Here, we have proposed a method for incorporating a farm model which simulates the transmission 378 of bacteria on a commercial pig farm, with a PKPD model which simulates the impact of 379 antimicrobial treatment on the selection of ESBL E. coli within the GIT. The results suggest that after 380 an initial introduction of the resistant bacteria onto the farm, prevalence rates will reach a steady 381 plateau. This suggests that if ESBL E. coli are introduced in sufficient quantity onto a commercial pig 382 farm, then on average, they are able to persist on the farm for at least 365 days and are likely to be 383 present in slaughter-aged pigs. The risk assessment predicted an average prevalence of ESBL E. coli of 39.4% (5<sup>th</sup> and 95<sup>th</sup> percentiles: 0.0-57.5) in slaughter-aged pigs. The latest UK veterinary antibiotic 384 resistance and sales surveillance report (VARSS report, 2017) found that 15% of caecal samples from 385 386 healthy pigs at slaughter were positive for ESBL E. coli (VMD, 2018), suggesting a reasonable level of 387 similarity (albeit with broad predicted percentiles). The results outlined may be useful for 388 subsequent farm-to-consumption QMRAs in order to consider the impact on human exposure, or for 389 further cost-benefit analyses to understand the financial costs of farm-based interventions.

390

Uniquely, this risk assessment shows how the addition of output from a PKPD model can add further 391 392 confidence to a farm-based risk assessment. This is especially important in predicting microbial load 393 in positive animals, which is fundamental for understanding the risk of onwards transmission. Due to 394 the large bacterial carrying capacity within the host GIT, results from the PKPD model suggest that 395 pigs excrete a high concentration of resistant bacteria on a daily basis. A previous model of AMR 396 transmission in pig finisher farms suggested that the proportion of pigs carrying resistant bacteria 397 was largely influenced by transmission rates between pigs and spontaneous clearance rates of 398 bacteria from the host (Abatih et al., 2009). Competitive exclusion using probiotic flora has been 399 found to be an effective method for reducing ESBL E. coli transmission between broiler chickens 400 (Ceccarelli et al., 2017). Further work should focus on reducing the carriage of resistant bacteria 401 within pigs.

402

An additional strength of the current risk assessment is in its ability to assess the comparative impact 403 404 of different control measures. In many infectious disease processes, the minority of high-shedding 405 animals are responsible for the majority of transmission, the so-called "super-shedding" animals 406 (Chase-Topping et al., 2008). The use of sick pens had the largest effect on this, reducing the 407 percentage of pigs shedding over 2  $\log_{10}$  cfu/g from 18.7% in the baseline scenario to 0.1%. 408 Enhanced C&D also created a beneficial effect, although not to the same extent as the use of sick 409 pens. The ability for farmers to apply strict biosecurity measures or isolation of sick pens is likely to 410 vary between commercial establishments. The current risk assessment did not consider whether 411 applying an enhanced C&D protocol would have an additional indirect benefit for AMR transmission, 412 by helping to reduce levels of endemic diseases and therefore antimicrobial usage. Additionally, it 413 did not consider whether heavy disinfectant use would offer a selective advantage to resistant 414 bacteria by preferentially removing sensitive bacteria. This has previously been suggested for various 415 antiseptics and heavy metals (Martin and Maris, 1995; Potenski et al., 2003; Braoudaki and Hilton, 416 2004; Soumet et al., 2012) however, the exact role that the use of disinfectants has on driving AMR resistance is controversial (Cheng et al., 2019). Further work is needed to investigate this factor 417 418 before it can reliably be incorporated into QMRA models. The use of sick pens here was designed as 419 an initial exploration into whether segregating sick pigs would reduce resistant bacteria transmission 420 amongst pigs (with the hypothesis that pigs being treated with antibiotics would have the highest

- 421 rate of excretion and that this high rate would have reduced by the time that pigs left the sick pen).
- Further work would be useful to understand the variations by which farmers may use sick pens. For
- 423 example, we have assumed a total segregation of sick pigs with no pen-to-pen transmission and that
- all pigs would return to their original pen after ceasing their antibiotic treatment. Realistic variationsupon this may be that sick pens are incompletely isolated therefore allowing some transmission to
- 426 non-sick pens; different numbers of sick pens and pigs per sick pen; more or less frequent cleaning
- 427 of the sick pens; and allowing pigs to remain in sick pens without returning to their original pen.
- 428

429 The PKPD model was based on a previous model for cattle (Cazer et al., 2017; Volkova, Cazer and 430 Gröhn, 2017) and adapted to pigs thanks to an extensive literature search to get physiological, 431 pharmacokinetics and bacterial data. Other authors have published similar PKPD model for swine 432 and ampicillin (Ahmad et al., 2016) but they used the plasma concentrations as a surrogate for the 433 impact of antimicrobial drug on the intestinal E. coli. This is however an over-simplification of reality 434 as the PK of drugs within the GIT is not only due to a passive equilibrium of the drug between plasma 435 and the intestinal lumen, but rather a combination of several simultaneous mechanisms of 436 excretion, reabsorption and transit that depends on the location within the GIT. Our model included 437 these processes to be more physiological and was developed in order to be easily adapted to other 438 antimicrobials and bacterial species. One limit concerns the lack of published longitudinal data on 439 faecal concentrations of amoxicillin and faecal E. coli in pigs treated with AMOX that could be used 440 to validate our PKPD model. However, our simulations are in accordance with published experiments 441 in pigs treated with ampicillin (which is close to AMOX) and showing a strong increase of the ESBL E. 442 coli levels in faeces after an IM treatment (Bibbal et al., 2007).

443

444 Despite the importance of the  $\beta$ -lactamase enzyme on the resistance phenomena by protecting the 445 resistant bacteria, the degradation of AMOX by these enzymes within intestines did not seem to be 446 an influential factor concerning the excreted quantity of AMOX according to the sensitivity analysis. 447 This is in agreement with older studies looking at the inactivation of amoxicillin by biological and 448 non-biological processes in human faeces (de Vries-Hospers et al., 1993; Jansen et al., 1992). 449 However, recent studies in mice have highlighted a positive influence of these enzymes on the 450 protection against ampicillin for intestinal bacteria not expressing  $\beta$ -lactamase enzyme, suggesting 451 the degradation of the  $\beta$ -lactam drug as the main factor explaining these findings (Gjonbalaj *et al.*, 452 2020). Overall, the importance of the gut microbiota on the metabolism of antimicrobial drug is an 453 ongoing subject (Zimmermann et al., 2019) and new data may help to refine the PKPD model.

454

The farm transmission model considered bacterial persistence within faeces in the pen environment 455 456 as a potential source of infection, but did not explicitly model any biofilm formation within the pens. This has been shown to enable resistant Salmonella Typhimurium to persist in the environment 457 458 (Tassinari et al., 2019). Interestingly, both the natural decay rate of ESBL E. coli and the rate at which 459 old faeces are lost from the pen floor had a large effect on the overall prevalence according to the 460 sensitivity analysis. In transmission studies of ESBL E. coli in broiler flocks, prevalence within birds 461 dropped to zero in the absence of antimicrobial usage but the pathogen was found to persist within 462 the pen environment (Dame-Korevaar et al., 2017). If the resistant bacteria being modelled were 463 found to successfully create biofilms within farm environments, this would affect parameters such as 464 the cleaning coefficients which have been incorporated into this current risk assessment.

465 Conversely, it may be possible that biofilm formation negatively affects the availability of bacteria to 466 animals within the environment, as evidenced by the zero prevalence in broiler flocks despite 467 persistence within the environment (Dame-Korevaar *et al.*, 2017).

468

469 Due to the closed nature of the pig farms modelled here, we had assumed that infected replacement 470 sows could enter the farm and shed to piglets (rather than bacteria entering via entry of older 471 animals). The previous Salmonella model allowed the pathogen to enter the farm via infected feed, 472 the environment (such as wildlife reservoirs), or infected sows (Hill et al., 2016). The current risk 473 assessment assumed that infected feed was unlikely to be a significant entry route for resistant 474 bacteria onto a farm. However, carbapenem-resistant Enterobacteriaceae have been found in gulls 475 (Köck et al., 2018) although the directional spread of resistant bacteria between pig farms and 476 environmental reservoirs is currently unknown. Moreover, airborne transmission has been found to 477 be a possible transmission route for livestock-associated methicillin-resistant Staphylococcus aureus 478 (LA-MRSA) on pig farms (Bos et al., 2016), therefore opening up the possibility of spread from 479 nearby farms. Although this may be a less relevant concern for ESBL E. coli, in order for this to truly 480 function as a generic risk assessment, more work is needed to understand the relative significance of 481 environmental routes for bringing resistant bacteria onto farms.

482

483 Several of the parameters in this risk assessment were extrapolated and therefore associated with 484 high uncertainty. For instance, farm management parameters, such as the cleaning coefficients, 485 were taken from Hill et al. (2015), and as such, we have assumed that *E. coli* within faeces reacts in a 486 similar fashion to Salmonella within faeces. Concerning the PKPD model, the plasmid transfer rate 487 was taken from in vitro studies with values differing by several orders of magnitude (Chauzy et al., 488 2019; Kristoffersson et al., 2020), and the inflow and outflow rate of bacteria within the GIT were 489 taken from previous models in cattle (Cazer et al., 2017; Volkova, Cazer and Gröhn, 2017). 490 Moreover, these parameters were among the most influential when looking at the results of the 491 GSA. Therefore, there is reasonable uncertainty regarding the absolute values of the prevalence and 492 load of resistant bacteria in slaughter-aged pigs. Interestingly, the number of colonised piglets on 493 day 1 of the model did not produce a very high influence in the sensitivity analysis suggesting that it 494 had a low effect on the overall prevalence. This is perhaps concerning, and suggests that even small 495 numbers of colonised piglets are sufficient to cause transmission of the bacteria throughout the 496 farm. Moreover, results were reasonably robust to the placement of the initial colonised piglets, 497 with carriage becoming possible in slaughter-aged pigs if piglets were placed together in one pen or 498 in several different pens.

499

500 The risk assessment outlined here suggests that after sufficient introduction of ESBL E. coli onto a pig 501 farm, the bacteria are likely to persist on the farm for at least a year leading to a high level of 502 carriage and faecal shedding in slaughter age pigs. Both isolating pigs in sick pens for the duration of 503 their antibiotic treatment and an enhanced C&D protocol were effective at reducing the number of 504 positive batches and the number of high-shedding pigs. Future work should concentrate on 505 repeating the analysis for other resistant bacteria (such as livestock-associated methicillin-resistant 506 Staphylococcus aureus (LA MRSA) or colistin – resistant E. coli) in order to understand interventions 507 which can control multiple resistant pathogens.

## 510 5 Declaration of interest

511 Declaration of interest: None.

512

## 513 6 CRediT author statement

514 Catherine M<sup>c</sup>Carthy: Methodology, Software, Writing – Original Draft. Alexis Viel: Methodology,
515 Software, Writing – Original Draft. Chris Gavin: Methodology, Software, Writing – Review & Editing.
516 Pascal Sanders: Conceptualization, Methodology, Writing – Review & Editing, Project administration.
517 Robin R.L. Simons: Conceptualization, Methodology, Writing – Review & Editing, Project
518 administration

519

520

## 521 7 Acknowledgements

522 This manuscript is part of the European Joint Programme One Health EJP. This project has received 523 funding from the European Union's Horizon 2020 research and innovation programme under Grant 524 Agreement No 773830. Matched funding was provided by the Veterinary Medicines Directorate 525 (APHA).

526 The authors would also like to thank the following people for their valuable comments and 527 assistance: Emma Snary, Richard Smith, Ginny Crouch and Rob Dewar at the APHA, UK and Jérôme 528 Henri and Michel Laurentie at Anses, France.

#### 530 References

- 531 Abatih, E. N. et al. (2009) 'Impact of antimicrobial usage on the transmission dynamics of
- antimicrobial resistant bacteria among pigs', *Journal of Theoretical Biology*, 256(4), pp. 561–573. doi:
  10.1016/j.jtbi.2008.10.017.
- 534 Avery, S. M., Moore, A. and Hutchison, M. L. (2004) 'Fate of Escherichia coli originating from
- livestock faeces deposited directly onto pasture', *Letters in Applied Microbiology*, 38(5), pp. 355–
  359. doi: 10.1111/j.1472-765X.2004.01501.x.
- 537 Bergstrom, C. T., Lipsitch, M. and Levin, B. R. (2000) 'Natural selection, infectious transfer and the 538 existence conditions for bacterial plasmids', *Genetics*, 155(4), pp. 1505–1519.
- Bos, M. E. H. *et al.* (2016) 'Transmission through air as a possible route of exposure for MRSA', *Journal of Exposure Science and Environmental Epidemiology*, 26(3), pp. 263–269. doi:
  10.1038/jes.2014.85.
- 542 Braoudaki, M. and Hilton, A. C. (2004) 'Adaptive resistance to biocides in Salmonella enterica and
- 543 Escherichia coli O157 and cross-resistance to antimicrobial agents.', *Journal of clinical microbiology*,
  544 42(1), pp. 73–78. doi: 10.1128/jcm.42.1.73-78.2004.
- 545 Cazer, C. L. *et al.* (2017) 'Monte Carlo simulations suggest current chlortetracycline drug-residue
  546 based withdrawal periods would not control antimicrobial resistance dissemination from feedlot to
- slaughterhouse', *Frontiers in Microbiology*, 8(SEP). doi: 10.3389/fmicb.2017.01753.
- 548 Ceccarelli, D. *et al.* (2017) 'Competitive exclusion reduces transmission and excretion of extended 549 spectrum-beta-lactamase-producing Escherichia coli in broilers', *Applied and environmental* 550 *microbiology*, 83(11), pp. 1–13. doi: https://doi.org/10.1128/AEM.03439-16.
- 551 Cheng, G. *et al.* (2019) 'Selection and dissemination of antimicrobial resistance in Agri-food 552 production.', *Antimicrobial resistance and infection control*, 8, p. 158. doi: 10.1186/s13756-019-
- 553 0623-2.
- 554 Dame-Korevaar, A. et al. (2017) 'Dynamics of CMY-2 producing E. coli in a broiler parent flock',
- 555 *Veterinary Microbiology*. Elsevier, 203(September 2016), pp. 211–214. doi:
- 556 10.1016/j.vetmic.2017.03.024.
- 557 Dohmen, W. et al. (2017) 'Risk factors for ESBL-producing Escherichia coli on pig farms: A
- longitudinal study in the context of reduced use of antimicrobials', *PLoS ONE*, 12(3). doi:
  10.1371/journal.pone.0174094.
- EC (2015) EUdraLex Volume 5 Pharmaceutical legislation for medicinal products for veterinary use.
   Available at: https://ec.europa.eu/health/documents/eudralex/vol-5\_en.
- EFSA (2011) 'Scientific Opinion on the public health risks of bacterial strains producing extended spectrum β-lactamases and/or AmpC β-lactamases in food and food-producing animals', *EFSA Journal*, 9(8), p. 2322. doi: 10.2903/j.efsa.2011.2322.
- 565 EFSA (2019) *The European Union One Health 2018 Zoonoses Report, EFSA Journal*. doi: 10.2903/j.efsa.2019.5926.
- Evers, E. G. *et al.* (2017) 'Comparative exposure assessment of ESBL producing Escherichia coli
  through meat consumption', *PLoS ONE*, 12(1). doi: 10.1371/journal.pone.0169589.
- 569 Filippitzi, M. E. *et al.* (2019) 'Quantitative risk model to estimate the level of antimicrobial residues
- 570 that can be transferred to soil via manure, due to oral treatments of pigs', *Preventive Veterinary*
- 571 *Medicine*, 167(November 2018), pp. 90–100. doi: 10.1016/j.prevetmed.2019.03.022.

- 572 Forum, W. E. (2013) *Global risks 2013: eighth edition*. doi: 10.1007/978-1-349-59857-1.
- 573 Freter, R., Freter, R. R. and Brickner, H. (1983) 'Experimental and mathematical models of 574 Escherichia coli plasmid transfer in vitro and in vivo', *Infection and Immunity*, 39(1), pp. 60–84.
- 575 Frey, H. C., Mokhtari, A. and Zheng, J. (2004) *Recommended practice regarding selection, application*
- and interpretation of sensitivity analysis methods applied to food safety process risk models.
  Washington, DC.
- 578 FSA (2006) Project M01028: Cleaning and Disinfection of Lairage-To- Stunning Areas in Abattoirs.
- 579 Gray, J. T. and Fedorka-Cray, P. J. (2001) 'Survival and infectivity of Salmonella Choleraesuis in swine 580 feces', *Journal of Food Protection*, 64(7), pp. 945–949. doi: 10.4315/0362-028X-64.7.945.
- Hill, A. A. *et al.* (2016) 'A farm transmission model for Salmonella in pigs, applicable to E.U. member
  states', *Risk Analysis*, 36(3).
- Kliebe, C. *et al.* (1985) 'Evolution of plasmid-coded resistance to broad-spectrum cephalosporins', *Antimicrobial Agents and Chemotherapy*, 28(2), pp. 302–307. doi: 10.1128/AAC.28.2.302.
- 585 Knothe, H. *et al.* (1983) 'Transferable resistance to cefotaxime, cefoxitin, cefamandole and
  586 cefuroxime in clinical isolates of Klebsiella pneumoniae and Serratia marcescens', *Infection*, 11, pp.
  587 315–317. doi: 10.1007/BF01641355.
- Köck, R. *et al.* (2018) 'Carbapenem-resistant Enterobacteriaceae in wildlife, food-producing, and
  companion animals: a systematic review', *Clinical Microbiology and Infection*, 24(12), pp. 1241–
  1250. doi: 10.1016/j.cmi.2018.04.004.
- Martin, H. and Maris, P. (1995) '[Antiseptic and antibiotic resistance of 310 gram-positive strains
  isolated from udders after use of post-milking teat germicides].', *Veterinary research*. England, 26(1),
  pp. 43–56.
- 594 Merck (2016) 'Streptococcus suis Infection', in MSD Veterinary Manual. Whitehouse Station, NJ:
- 595 MSD. Available at: https://www.msdvetmanual.com/generalized-conditions/streptococcal-
- 596 infections-in-pigs/streptococcus-suis-infection#v3275292.
- Mughini-Gras, L. *et al.* (2019) 'Attributable sources of community-acquired carriage of Escherichia
   coli containing β-lactam antibiotic resistance genes: a population-based modelling study', *The Lancet Planetary Health*, 3(8), pp. e357–e369. doi: 10.1016/S2542-5196(19)30130-5.
- 600 Munk, P. *et al.* (2018) 'Abundance and diversity of the faecal resistome in slaughter pigs and broilers 601 in nine European countries', *Nature Microbiology*. doi: 10.1038/s41564-018-0192-9.
- NethMap (2019) NethMap 2019: Consumption of antimicrobial agents and antimicrobial resistance
   among medically important bacteria in the Netherlands.
- Pitout, J. D. D. and Laupland, K. B. (2008) 'Enterobacteriaceae : an emerging public-health concern',
   *The Lancet Infectious Diseases*, 8(March).
- Potenski, C. J., Gandhi, M. and Matthews, K. R. (2003) 'Exposure of Salmonella Enteritidis to chlorine
  or food preservatives decreases [corrected] susceptibility to antibiotics.', *FEMS microbiology letters*.
  England, 220(2), pp. 181–186. doi: 10.1016/S0378-1097(03)00099-5.
- 609 Soumet, C. *et al.* (2012) 'Resistance to phenicol compounds following adaptation to quaternary
- ammonium compounds in Escherichia coli.', *Veterinary microbiology*. Netherlands, 158(1–2), pp.
  147–152. doi: 10.1016/j.vetmic.2012.01.030.
- Tassinari, E. et al. (2019) 'Microevolution of antimicrobial resistance and biofilm formation of

- Salmonella Typhimurium during persistence on pig farms', *Scientific Reports*, 9(1), pp. 1–12. doi:
  10.1038/s41598-019-45216-w.
- 615 VMD (2018) *UK Veterinary Antibiotic Resistance and Sales Surveillance (VARSS) 2017.* Available at:
- https://assets.publishing.service.gov.uk/government/uploads/system/uploads/attachment\_data/file
   /915743/\_1691664-v1-VARSS\_2017\_Watermark\_FINALx-accessible.pdf.
- Volkova, V. V. *et al.* (2012) 'Mathematical model of plasmid-mediated resistance to ceftiofur in
   commensal enteric escherichia coli of cattle', *PLoS ONE*, 7(5). doi: 10.1371/journal.pone.0036738.
- 620 Willis, C. et al. (2018) Surveillance Study of Antimicrobial Resistance in Bacteria Isolated from Chicken
- 621 *and Pork Sampled on Retail Sale in the UK*. Available at:
- https://www.foodstandards.gov.scot/downloads/AMR\_in\_chicken\_and\_pork\_Final\_Report\_July\_2018\_Final.pdf.
- 624 World Health Organization (2015) *Global Action Plan on Antimicrobial Resistance*. doi:
- 625 10.1128/microbe.10.354.1.