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Rapid estimation of *Salmonella enterica* contamination level in ground beef – Application of the time-to-positivity method using a combination of molecular detection and direct plating

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1	Rapid Estimation of Salmonella enterica Contamination Level in Ground Beef –
2	Application of the Time-to-Positivity Method Using a Combination of Molecular
3	Detection and Direct Plating
4	
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16	
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22 ABSTRACT (176 of 200 words)

Little progress has been made in decreasing the incidence rate of salmonellosis in the 23 24 US over the past decade. Mitigating the contribution of contaminated raw meat to the 25 salmonellosis incidence rate requires rapid methods for quantifying *Salmonella*, so that 26 highly contaminated products can be removed before entering the food chain. Here we evaluated the use of Time-to-Positivity (TTP) as a rapid, semi-quantitative approach for 27 28 estimating Salmonella contamination levels in ground beef. Growth rates of 14 29 Salmonella strains (inoculated at log 1 to -2 CFU/g) were characterized in lean ground beef mTSB enrichments and time-to-detection was determined using culture and 30 31 molecular detection methods. Enrichments were sampled at five timepoints and results were used to construct a prediction model of estimated contamination level by TTP 32 (superscript indicates time in hours) defined as TTP⁴: \geq 5 CFU/g; TTP⁶: \leq 5, \geq 1 CFU/g; 33 TTP⁸: ≤ 1 , ≥ 0.01 CFU/g; with samples negative at 8h estimated ≤ 0.01 CFU/g. Model 34 performance measures showed high sensitivity (100%) and specificity (83% and 93% 35 for two detection methods) for samples with a TTP⁴, with false negative rates of 0%. 36 37

39 Highlights

40	•	Time-to-Positivity sampling method can detect Salmonella levels \geq 5 CFU/g in
41		ground beef enrichments at 4h.
42	•	Direct plating with Petrifilm [™] EB and replica plating to XLD provides confirmation
43		of counts and evidence of viability.
44	•	Average DT of Salmonella in enrichments was 19.5 min, however some strains
45		grew faster with DT of 15.5 min.
46	•	At low inoculation levels certain Salmonella grew poorly and were outcompeted
47		by ground beef microflora.
48		

49 **1. Introduction**

Salmonella enterica is a leading cause of bacterial foodborne illness in the U.S. with an 50 estimated incidence rate (IR) of 18.3 per 100,000 people and a projected 1.2 million 51 cases each year (CDC, 2013; Painter et al., 2013; Scallan et al., 2011; Tack et al., 52 2019). A recent survey conducted by the Food Safety and Inspection Service (FSIS) 53 showed that the majority of Salmonella outbreaks are broadly attributed to a number of 54 55 commodity groups, with poultry, eggs, seeded vegetables and beef at the top of the list 56 of food categories identified (17%, 12%, 12% and 9% respectively; (IFSAC, 2018)). 57 Beef related outbreaks are generally limited in scope, with the number of illnesses (on 58 average <30 cases/outbreak) tending to be a fraction of those caused by produce or poultry sources (on average >100 illnesses/outbreak)(Laufer et al., 2014). However, 59 60 recent outbreaks in the U.S. attributed to the consumption of ground beef contaminated 61 with Salmonella Newport have resulted in over 400 illnesses and the recall of more than 10 million pounds of ground beef (4.5 x 10⁶ kg) (Marshall et al., 2018; Plumb et al., 62 63 2019). These developments have resulted in increased scrutiny on the presence of Salmonella in ground beef. 64

65

While *Salmonella* is not presently regulated as an adulterant in raw meat, FSIS has
historically established performance standards for *Salmonella* contamination in raw
meat products in order to monitor whether establishments have effective process
controls in place to address *Salmonella* contamination (USDA-FSIS, 2015, 1996).
Moreover, FSIS has recently proposed new performance standards making use of a 52week moving window sampling approach in beef establishments that produce greater

72 than 50,000 pounds of raw ground beef per day (2.3 x 10⁴ kg), with no more than two of 73 48 samples being positive for Salmonella within the moving window (USDA-FSIS, 2019a). However, in spite of these monitoring efforts and the implementation of 74 75 numerous process controls in various food production industries, there has been little progress in decreasing the IR of salmonellosis over the past decade, which has in fact 76 increased 9% from a level of 15 cases per 100,000 in 2010, to 18.3 cases per 100,000 77 78 in 2018 (McEntire et al., 2014; Sampedro et al., 2018; Tack et al., 2019). While many 79 factors undoubtedly contribute to this outcome, a central issue is that the current approach to monitoring Salmonella contamination in foods is based only on prevalence 80 81 testing (presence-absence or qualitative testing) and has no requirement for estimating the contamination levels present in the commodities being tested (McEntire et al., 2014; 82 83 Sampedro et al., 2018). This is likely because enumeration methods that are currently 84 recommended or approved for use are time consuming, expensive and not practical for high throughput analyses or use in large scale production settings (Kim et al., 2017; 85 86 Owen et al., 2010). And yet, an understanding of the range of contamination levels encountered in various phases of any food production system is needed to identify the 87 critical control points of that system (Crump et al., 2002; Koyuncu et al., 2010). The 88 89 present lack of quantification data on Salmonella in products makes it almost impossible 90 to determine the threshold values that lead to illnesses and outbreaks.

91

For outbreaks where it has been possible to estimate the *Salmonella* contamination
level, it has been shown that a majority of these (83%) have resulted from consuming *Salmonella* contaminated products with doses >100 CFU (Blaser and Newman, 1982;

Teunis et al., 2010). Additionally, the results of a limited number of published human
inoculation studies indicate that consuming products with higher levels of *Salmonella* is
more likely to result in infection (Haas, 2002; Haas, 1983; McCullough and Eisele,
1951). Thus, what is needed to achieve meaningful gains in public health is 1) an
understanding of the levels of contamination encountered in food production systems,
and 2) the ability to rapidly detect products contaminated at higher levels so that they
can be removed from the food chain.

102

The standard method for bacterial enumeration in foods has traditionally been the most 103 104 probable number (MPN) method (Cochran, 1950; Sutton, 2010). While the MPN method 105 makes use of enrichments of dilutions of a given sample to estimate initial 106 contamination level, a different approach for estimating pathogen level that has not yet 107 been extensively explored in the area of food safety is sampling enrichment cultures over time to examine Time-to-Positivity (TTP). The concept of TTP has been explored in 108 109 the field of human medicine for the past 25 years, and increasingly so in the past decade (Lamy, 2019). With regard to blood cultures which are continuously monitored 110 for growth, TTP provides indirect information on the contamination level and growth rate 111 112 of bacteria present. In the area of food safety, Weidemaier et al., have described an 113 approach for real-time monitoring of pathogen level during enrichment using Surface Enhanced Raman Scattering nanoparticles in combination with a pathogen specific 114 115 immunoassay (Weidemaier et al., 2014). They found that continuous monitoring of pathogens in enrichment cultures decreased the time-to-results by taking advantage of 116 variation in bacterial load, with more highly contaminated samples showing a decreased 117

118 TTP. While the authors concluded that the cost of reagents for large sample volumes 119 and the stability of antibodies present in the enrichment cultures were limitations for the 120 practical application of this method in food industry settings, the study never-the-less 121 demonstrated the utility of real-time monitoring of pathogens in enrichments for 122 identifying more highly contaminated samples.

123

124 Here, we evaluated the use of the TTP approach for rapidly estimating Salmonella 125 contamination levels in ground beef products. To accomplish this, we examined 126 Salmonella growth rates and time to detection in inoculated lean ground beef samples 127 using 1) two commercially available kits based on molecular detection of *Salmonella*, 2) 128 immunomagnetic separation (IMS) with secondary enrichment in RVS followed by plating on selective medium, and 3) direct plating enumeration of viable Salmonella. 129 130 The results describe the growth rates of various Salmonella strains and serotypes in ground beef enrichments (GBE); the efficacy of molecular detection methods for 131 identifying *Salmonella* contamination in ground beef enrichments at given timepoints; 132 and performance measures of a novel testing method for estimating Salmonella 133 contamination levels in ground beef samples based on TTP. 134

136 **2. Materials and methods**

137

138 2.1 Strains and culture conditions

139

The Salmonella strains used in this study are listed in Table 1. All strains were revived 140 from -80 °C glycerol stocks and cultured on Tryptic Soy Agar plates (TSA; Difco, 141 142 Becton-Dickinson, Franklin Lakes, NJ, USA) at 37°C for 18 to 22 h. Prior to ground beef 143 inoculation, each culture was prepared by inoculating a single colony from a fresh TSA plate into 5 ml of mTSB (modified Tryptic Soy Broth, Becton-Dickinson) that was 144 145 incubated overnight without shaking at 37°C for 18 to 20 h. Each culture was diluted 1:100 into fresh mTSB medium and incubated without shaking at 37°C to an OD₆₀₀ of 146 147 \approx 0.06 (approximately 10⁷ CFU/ml). Bacterial cells were then harvested by centrifugation 148 at 3000 x g for 10 min at 4°C. The mTSB supernatant was removed and the pellet resuspended in 10 ml of phosphate buffered saline (PBS; Amresco, LLC, Solon, OH, 149 USA). The resulting bacterial suspension was serially diluted to 10^{-5} ($\approx 10^2$ CFU/ml). The 150 bacteria were then stressed by starvation in PBS maintained at room temperature (RT) 151 for 24h. Prior to inoculation, the starved inoculum was diluted to 10⁻⁸ such that four 152 inoculation levels were used for each strain (10²/ml, 10¹/ml, 10⁰/ml, and 10⁻¹/ml). A 1 ml 153 portion of each dilution was plated on Petrifilm[™] EB (3M, St. Paul, MN, USA) and 154 incubated at 37°C for 18 to 20 h to estimate the concentration of each inoculum. 155 156

158

157

2.2 Ground beef inoculation

159 For each strain evaluated, ground beef in five-pound (2.3 kg) chubs, that originated from the same lot (code and expiration date) and that had been maintained at 4°C in original 160 packaging prior to inoculation was used. Five portions of ground beef (325g; 93% lean: 161 7% fat) were placed into sterile filter bags (BagPage+ 3500, Interscience, Woburn, MA, 162 163 USA) and each was inoculated with 10 ml of *Salmonella* as prepared above, or with 10 ml of sterile PBS (non-inoculated control). The inoculated ground beef samples were 164 165 allowed to rest at RT for 5 min prior to the addition of 975 ml of prewarmed (42°C) 166 mTSB and were then stomached at 420 RPM for 1 min in a laboratory blender (JumboMix 3500, Interscience, Woburn, MA, USA). The resulting ground beef 167 168 enrichments (GBE) were incubated statically at 42°C for 24 h. To measure the growth of 169 each strain at each inoculation level in the absence of ground beef and the resulting microflora, parallel mTSB cultures (97 ml mTSB also pre-warmed at 42°C) were 170 171 inoculated with either 1ml each of the 10² or 10¹ CFU/ml inocula, or 10ml each of the 10⁰, 10⁻¹ CFU/ml or the sterile PBS control. These mTSB control enrichment samples 172 173 were also incubated statically at 42°C.

174

2.3 *Salmonella* prevalence and concentration estimates in GBE and mTSB enrichmentsamples

177

At each timepoint (T in hours: T0, T4, T6, T8, and T24) an 8 ml portion from each GBE and a 5 ml portion from each mTSB control, was removed to assess the presence and level of *Salmonella*. The difference in the volume of samples collected from each sample type was to ensure that 1) we had sufficient GBE sample for the subsequent

182 steps in the analysis which included IMS, glycerol stock storage for downstream 183 analysis and lysis for the Salmonella molecular detection assays used; and 2) that we did not significantly deplete the control mTSB sample with repeated sampling over the 184 course of enrichment. GBE samples were briefly centrifuged at 76 x g for 30 sec to 185 pellet debris, then 1 ml was used for IMS with anti-Salmonella IMS beads (Applied 186 Biosystems, Foster City, CA, USA) as previously described (Bosilevac et al., 2009). 187 188 Recovered IMS beads were transferred to 3 ml of RVS medium and this secondary 189 enrichment was incubated at 42°C for 18 to 22h. Sterile cotton swabs were used to subculture RVS enrichments (~50 ul) to XLD (Oxoid) agar plates, which were streaked 190 191 for isolation and then incubated at 37°C for 18 to 22h. Salmonella were identified on 192 XLD plates as black colonies with a clear outer ring. Any suspect colonies (including those with abnormal colony morphology on XLD) were picked for confirmation using a 193 194 Salmonella specific PCR assay for the invA gene (Nucera et al., 2006; Rahn et al., 1992). 195

196

197 Salmonella concentrations in both GBE and mTSB cultures were assessed at the 198 following timepoints by plating 1 ml each of enrichment or 10-fold dilution in PBS (T0: 10°; **T4**: 10°, 10⁻¹, 10⁻²; **T6**: 10⁻², 10⁻³, 10⁻⁴; **T8**: 10⁻⁴, 10⁻⁵, 10⁻⁶; and **T24**: 10⁻⁷, 10⁻⁸ and 199 10-9) onto Petrifilm[™] EB then incubating at 37°C for 18 to 22h and counted manually or 200 201 with a 3M Petrifilm[™] counter. *Salmonella* counts were estimated using a previously 202 described replica plating method (Webb et al., 2017) that involves carefully peeling back and removing the plastic film lid of the EB Petrifilm[™] plate, and replica plating it onto an 203 XLD agar plate (Figure S1). XLD plates were incubated at 37°C for 18 to 22h and 204

205 Salmonella counts were determined by counting typical black colonies present on the 206 XLD medium. Questionable isolates on XLD were picked and confirmed using the invA 207 PCR assay described above. Salmonella counts from replica plating GBE samples at 208 T0, were used to calculate the observed starting concentration of inoculated Salmonella, in combination with the theoretical T0 counts estimated by plating 1ml of 209 each inoculum (-5, -6, -7, -8) to EB Petrifilm[™], and then multiplying by 10 to account for 210 211 the 10ml inoculum, resulting in starting CFU/g estimates for each inoculated GB 212 sample.

213

214 2.4 Growth curves and doubling time calculations in mTSB and GBE

215

Growth curves were constructed for each Salmonella strain evaluated at each 216 217 inoculation level, using log transformed viable cell number estimates (CFU/ml) determined at each timepoint as described above. Linear regression analysis was 218 219 performed on the exponential growth phase for each curve, from T4 to T8, and the resulting linear equations were used to calculate doubling time (DT) using three 220 221 concentrations (3.0, 3.3 and 3.6 log CFU/ml) as input. For each strain used, DT estimates for each growth condition (mTSB or GBE) were averaged using the values 222 calculated from each inoculation level as a replicate (i.e. 10¹, 10⁰, 10⁻¹ and 10⁻²) and are 223 reported along with the corresponding standard deviation (SD) in Table 1. DT in GBE 224 225 were ranked shortest to longest and then averaged among "fast" or "slow" growers 226 (Table 1). Changes in DT for growth in mTSB versus growth in GBE were assessed by subtracting average DT in GBE from that in mTSB. 227

228

229 2.5 Molecular detection of *Salmonella* in GBE

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231 Enrichment samples were assayed for the presence of Salmonella at each timepoint 232 using two molecular detection methods: the 3M Molecular Detection Assay 2 -Salmonella (MDA2SAL96; 3M, St. Paul, MN, USA; here after referred to as 3M), and 233 234 the BAX® System Real-Time PCR Assay Salmonella (KIT2006; Hygiena, Camarillo, 235 CA, USA; here after referred to as BAX). For the 3M assay, samples were handled as per manufacturer's instructions, with the exception that the enrichment medium used 236 237 was that indicated in FSIS MLG-4, (i.e. mTSB), as opposed to BPW (USDA-FSIS, 2019b). In short, at each timepoint, 20 ul of enrichment was added to 580 ul of lysis 238 buffer, incubated at 99 to 101 °C for 15 min, then cooled to 20 to 25 °C for 5 min. An 239 240 aliquot of 20 ul of this lysate was used in the molecular detection assay where the 3M Molecular Detection Software (version 2.5.0.0) called positives and negatives. For the 241 242 BAX® assay, samples were analyzed as per manufacturer's instructions, with the exception that novobiocin was not added to the mTSB enrichment medium. For this 243 assay, at each timepoint, 5 ul of enrichment was added to 200 ul of lysis-buffer that was 244 incubated at 37 °C for 20 minutes, then at 95 °C for 10 minutes, and finally cooled to 2 245 246 to 8 °C for a minimum of 5 minutes. A 30 ul aliquot of this lysate was used in the BAX molecular detection assay and positive and negative samples were called on the BAX® 247 248 System Q7 instrument software (version 3.6.6005).

249

2.6 Analysis of the relationship between Time-to-Positivity (TTP) in GBE and starting
contamination level of *Salmonella*

252

253 The relationship between initial (T0) Salmonella contamination level and the Time-to-254 Positivity (TTP) of an enrichment using the molecular detection methods, was examined for each Salmonella strain at each inoculation level (n= 56 data points for 14 strains 255 inoculated at four different levels, 10¹, 10⁰, 10⁻¹ or 10⁻² CFU/g). Sample starting 256 257 concentrations were grouped by timepoint when first detected as positive with either the 258 3M or BAX method, and then the mean starting (T0) concentration (log CFU/g), the 95% 259 confidence interval of this mean were calculated, and the minimum, and maximum 260 values for each category were identified (Figure 1). The distribution of the resulting data 261 points was further visualized by plotting starting contamination level (log CFU/g) by 262 timepoint first detected positive (T4, T6, T8 or T24), using a violin plot (displaying the median and guartile contamination levels within each timepoint category; Figure 1). 263 264 Finally, direct plating estimates of *Salmonella* levels present in enrichments at each timepoint evaluated (n=280 timepoints for 14 strains at 4 inoculation levels, sampled at 265 5 timepoints) allowed for an examination of the limits of detection (LOD) of each of the 266 267 molecular methods used and are summarized in Tables 2 and 3.

268

269 2.7 Statistical Analyses

270

Growth rates (DT) in GBE and mTSB for each *Salmonella* strain were calculated as
described in section 2.4 above. Significant differences between "fast" and "slow"

273 growing *Salmonella* in GBE and mTSB, and in changes in DT for growth in GBE or mTSB were analyzed using Prism 8.0 software (GraphPad, San Diego, CA) and a two-274 tailed unpaired t-test of significance, with $P \le 0.05$ (Table 1). Violin plots also were 275 constructed using Prism 8.0. To analyze the efficacy of TTP as an estimate of starting 276 concentration, performance measures for the prediction model using BAX or 3M 277 molecular detection methods were calculated, including sensitivity, specificity, positive 278 279 predictive value (PPV), negative predictive value (NPV), false positive rate (FPR) and false negative rate (FNR). To examine sensitivity and limits of detection for the 280 Salmonella assays, the Salmonella concentration in enrichment samples were grouped 281 282 either by T0 inoculation level (CFU/g, n=56; Table 2) or by average concentration at 283 detection (log CFU/ml, n=236; Table 3). The mean Salmonella log CFU/ml, SD and 284 percentage of samples in each log interval found positive by the IMS, BAX or 3M 285 assays were calculated using Prism 8.0 and reported in Tables 2 and 3. 286 3. Results 287 288 289 3.1 Salmonella growth rates in mTSB ground beef enrichments 290 In this study, the growth rates of 14 Salmonella strains in mTSB alone and mTSB 291 ground beef enrichments (GBE) at 42°C were determined. Growth rates in mTSB alone 292 293 were found to be on average 20.4 min but in GBE were observed to be about three 294 minutes faster, (17.6 min; Table 1). Ranking strains by shortest to longest average DT 295 in mTSB or GBE revealed that some strains were able to grow faster than others in both 296 growth conditions. Fast growing strains had an average DT of 15.5 min or 19.4 min, as opposed to slow growing strains with a DT of 19.5 min or 21.4 min in GBE or mTSB 297 respectively. Moreover, strains that grew faster in mTSB and GBE also were observed 298 299 to have a greater decrease in DT for growth in GBE as compared with mTSB (on 300 average 3.9 min shorter), while those that grew more slowly demonstrated an average 1.8 min decrease in DT between GBE and mTSB (Table 1). For the six serotypes 301 302 evaluated, both fast and slow growing strains were found in serotypes Newport, 303 Enteritidis, Typhimurium and Montevideo, suggesting that clade specific differences within serotype may impact growth rates in enrichment. Conversely, both Anatum 304 305 strains were found to be fast growers (average DT of 15.8 min and 18.9 min in GBE and 306 mTSB respectively), while both Dublin strains were slow growers (average DT of 19.3 307 min and 21.1 min in GBE and mTSB, respectively). However, a greater number of 308 strains would need to be evaluated to confirm if these are consistent growth phenotypes 309 for these serotypes.

310

3.2 Determination of detection limits for *Salmonella* immunocapture and moleculardetection methods

313

Molecular detection assays for *Salmonella* from inoculated and uninoculated GBE resulted in the analysis of 350 GBE samples. Of these, 70 were negative control samples, that would only have been positive for *Salmonella* contamination if the ground beef used was already contaminated with *Salmonella*, and this was not observed to be the case in this study. The remaining 280 samples were obtained from GBE inoculated

319 with Salmonella at the levels described. Of these, 84.3% were found to be culture 320 positive by direct plating on EB Petrifilm[™] and replica plating to XLD, 81.1% were found positive by IMS, 61.4% by BAX and 58.2% by 3M assays. The data collected provided 321 322 the opportunity to examine the detection limits of the assays used. Samples were 323 grouped by inoculation level (average log CFU/g = 0.95 (n=13); -0.02 (n=14); -1.02 (n=14); -2.07 (n=15)) and the average level of *Salmonella* (log CFU/ml) in enrichments 324 325 for each of these groups by timepoint was determined (Table 2). This analysis revealed 326 the average Salmonella concentration by inoculation level and timepoint, where each 327 detection assay used was found to have the highest accuracy for detecting Salmonella. 328 As shown in Table 2, for samples inoculated at 0.95 log CFU/g this was T4 (average Salmonella concentration was 3.14 log CFU/ml), for -0.02 log CFU/g this was T6 329 (average concentration 4.28 log CFU/ml), for -1.02 log CFU/g this was T8 (average 330 331 concentration 5.57 log CFU/ml) and for -2.07 log CFU/g this was T24 (average concentration 7.55 log CFU/ml). 332

333

Detection limits of the tests employed also were examined by grouping all samples 334 found positive for Salmonella (n=236) by the observed log CFU/ml concentration in 335 336 enrichment, by log intervals (0, 1, 2, etc.). For each group of values, the n, average log CFU/ml, SD and % of samples found positive by either the IMS, BAX or 3M tests were 337 calculated and are summarized in Table 3. This analysis showed that the IMS method 338 339 consistently detected Salmonella contamination in enrichments once the average 340 concentration reached 2.44 log CFU/ml, while BAX and 3M demonstrated consistent Salmonella detection once levels in enrichment reached 4.43 to 5.51 log CFU/ml (Table 341

342 3). This analysis also demonstrated the difference in sensitivity between the 3M and
343 BAX detection methods, as BAX identified more samples as positive for *Salmonella*344 contamination at lower concentrations in enrichment culture.

345

3.3 Examining the relationship between *Salmonella* starting concentration and Time-toPositivity (TTP) in enrichment

348

349 Examination of the relationship between starting contamination level and TTP using the 350 3M and BAX methods revealed that testing at defined timepoints could be used to 351 reliably estimate Salmonella starting concentration. This phenomenon was first explored 352 by examining the frequency distribution of starting concentration (log CFU/g) as a 353 function of timepoint first detected positive. For this analysis, 55 data points were 354 examined. The BAX assay included: T4, n=20; T6, n=24; T8, n=9; T24, n=2; and the 3M assay included: T4, n=16; T6, n=22; T8, n=16; T24, n=1 (Figure 1). Grouping T0 log 355 356 CFU/g values by TTP allowed for the calculation of mean T0 CFU/g and 95% confidence intervals, as well as minimum and maximum values within each group, by 357 detection assay. This analysis showed that samples with an average starting 358 concentration of 0.58 log CFU/g (95% CI 0.33, 0.83) for BAX and 0.76 log CFU/g (95% 359 360 CI 0.54, 0.99) for 3M assays, could be detected by T4 (Figure 1). Samples that were negative for Salmonella detection at T4 but positive at T6 were found to have an 361 362 average starting concentration of -0.90 log CFU/g (95% CI -1.22, -0.58) for BAX and -363 0.61 log CFU/g (95% CI -0.90, -0.31) for 3M. Accordingly, a matrix of average starting concentrations and TTP was constructed. From this matrix, sensitivity, specificity and 364

365 other metrics of precision were determined for both assays, for the ability to estimate starting concentration (Table 4). These analyses showed that both detection methods 366 had high sensitivity for identifying samples contaminated at or above the defined levels 367 (TTP superscripts indicate time in h): TTP⁴ \geq 5.0 CFU/g; TTP⁶ \leq 5.0, \geq 1.0 CFU/g; and 368 TTP⁸ \leq 1.0, \geq 0.01 CFU/g), although specificity, precision and accuracy for the 3M 369 assay were all greater than those observed for the BAX assay, at each of the defined 370 371 levels. Negative predictive values and false negative rates were however the same for the BAX and 3M assays (Table 4). 372

373

374 **4. Discussion**

375

376 Here we explored the utility of TTP as a way of rapidly estimating Salmonella contamination level in ground beef samples. To accomplish this, we characterized the 377 378 growth dynamics of *Salmonella* in ground beef enrichments by determining growth rates 379 of 14 strains of Salmonella inoculated at concentrations ranging from log 1 to -2 CFU/g. 380 Prior to inoculation, all Salmonella strains used were starved in PBS in order to simulate 381 potential environmental stress encountered by the organism that might impact the 382 length of the lag phase. We examined the limits of detection of two molecular detection methods by testing five enrichment timepoints. At each timepoint two culture methods 383 also were used to detect Salmonella. This combination of culture and molecular 384 385 detection at various timepoints, allowed for an examination of the relationship between initial contamination level and TTP. The data collected support the idea that enrichment 386

analysis at select timepoints, as opposed to the canonical end-point sampling, can be
used to estimate the starting contamination level of the sample being tested.

389

390 It should be noted that while the testing method described here was developed using 391 lean ground beef enrichments, the resulting workflow for characterizing the relationship between starting concentration and TTP, could readily be applied to any enrichment 392 393 type (poultry, produce, etc.) with an understanding of the growth rate of Salmonella in a 394 given enrichment/microflora matrix, and the limits of detection of the test method 395 employed. Use of this approach can facilitate the identification of highly contaminated 396 product before it enters the food chain. This testing method would also enable food 397 producers to investigate the root causes of practices that result in higher levels of 398 contamination, ultimately decreasing the incidence of exposure to levels of Salmonella 399 that cause illness, and positively impacting human health (McEntire et al., 2014). 400

401 The utility of this concept was investigated by plotting the distribution of estimated initial Salmonella concentration by timepoint first detected positive using either molecular 402 detection method (Figure 1). This analysis showed that the majority of samples positive 403 at T4 had initial concentrations of Salmonella greater than 5 CFU/g (log 0.69), with a 404 405 smaller fraction actually contaminated at lower concentrations (i.e. false positive, in that they were misclassified as having a greater starting concentration than that 406 407 experimentally measured; illustrated in Figure 1). Those positive at T6 had a much 408 broader range of initial concentrations, ranging from 0.01 to 2.3 CFU/g (log -2 to 0.36) with an average of 0.4 CFU/g (log -0.39). Samples that were negative at T4 and T6 but 409

410 positive at T8 had initial concentrations ranging from 0.003 to 0.2 CFU/g (log -2.5 to -0.69). These data were used to construct a prediction model of estimated contamination 411 level by TTP (Table 4) defined as (with TTP superscript indicating time in h) TTP⁴: \geq 5 412 CFU/g; TTP⁶: \leq 5, \geq 1 CFU/g; TTP⁸: \leq 1, \geq 0.01 CFU/g; with samples found negative at 413 414 T8 estimated to have levels ≤ 0.01 CFU/g. Performance measures evaluating the ability 415 of the model to predict true positives and true negatives showed the model to be highly sensitive (100%) for identifying samples with concentrations equal to or greater than the 416 predicted levels. Further, false negative rates were 0% and negative predictive values 417 were 100%. However, more variability was observed with respect to specificity, positive 418 419 predictive value and accuracy performance measures (Table 4). For samples 420 contaminated at higher levels (log CFU/g 0.95 with a TTP of 4 h), BAX and 3M assays 421 demonstrated false positive rates (as defined above) of 17% and 7%, respectively. It was also noted that samples inoculated with higher levels of Salmonella appeared to 422 423 have an increased competitive advantage over the background flora, resulting in a 424 decreased time to detection, possibly due to the production of siderophores or microcins 425 (Guillier et al., 2013; Sassone-Corsi et al., 2016).

426

Samples inoculated at lower starting concentrations (≤ 1 CFU/g) had greater false positive rates (as defined above) and were more likely to be misclassified as having a greater starting concentration than that experimentally measured. The likelihood of this was greater for samples tested with BAX than with the 3M assay, with false positive rates of 61% and 43%, respectively (Table 4 and Figure 1). This is likely the result of differences in sensitivity between the two assays. While both assays target DNA, each

433 uses a different chemistry. The BAX assay is qPCR based while the 3M uses isothermal amplification. Also, each assay evaluates slightly different enrichment sample volumes 434 with different lysis buffer systems and molecular targets. As such, we found that for 435 436 enrichment samples where the Salmonella concentration had reached an average log 437 CFU/ml of 2.44 (n=31) or 3.46 (n=31), BAX was able to detect it in 51.6% and 83.9% of samples, while 3M detected 32.3% and 74.2%, respectively (Table 3). By the time 438 439 Salmonella levels in enrichments reached an average log CFU/ml of 4.43 (n=28) or 5.51 440 (n=18) the difference in sensitivity was negligible however, as both BAX and 3M detected Salmonella in 96.4% and 100% of enrichments with these levels, respectively. 441 442 As a result of its increased sensitivity, the BAX assay identified samples contaminated with lower starting concentrations at earlier timepoints, with concomitantly shorter TTP 443 444 values. In the present study, samples were collected from enrichments every two hours 445 during the exponential growth phase (T4 to T8). Future work examining TTP with more 446 narrow sampling time periods may result in an improved model of initial contamination 447 level and TTP. The data presented however, demonstrate the impact of method sensitivity on TTP and the need for validation of each detection platform used for this 448 449 purpose.

450

Finally, differences in *Salmonella* growth rates in mTSB and GBE were observed in this
study (Table 1) and appeared to contribute to greater variation in specificity and
accuracy of the TTP estimation method for identifying samples contaminated in the
mean 0.43 to 0.03 CFU/g (log -0.37 to -1.5) range (TTP⁶ and TTP⁸). Specifically, faster
growing strains demonstrated shorter TTP and were identified by the prediction model

456 as having greater starting concentrations than those measured experimentally.

Conversely, slower growing strains appeared to have a diminished capacity to compete 457 458 with background flora, especially when inoculated at lower levels. It has been observed 459 previously that competition with background flora may exert a marked effect on the 460 growth of Salmonella, inhibiting outgrowth in an enrichment medium and leading to failure to detect Salmonella when they were actually present (Daiguigan et al., 2016; 461 462 Litchfield and Insalata, 1973). An example of this phenomenon was observed with both 463 serovar Dublin strains used in this study. When inoculated at the -2 log CFU/g level, the Dublin were found to have reached 6.5 log CFU/ml by T24, while more competitive 464 465 Salmonella strains inoculated at the same level were 100-fold higher with an average 466 8.18 log CFU/ml. These data suggest that for some Salmonella strains detection might be improved by sampling at earlier timepoints (likely T8 to T12) where they have 467 468 reached the level of detection but have not yet been outcompeted by background microflora. These data also suggest that IMS may be an important tool for detecting 469 470 Salmonella that are poor competitors in GBE. Further research on this phenomenon is needed to examine the distribution of these growth phenotypes within and among 471 Salmonella serotypes, and to determine their impact on TTP in different enrichment 472 473 matrices.

474

475 **5. Conclusions**

We evaluated the use of TTP for estimating *Salmonella* contamination levels in ground
beef. The data presented lay the foundation for a rapid, semi-quantitative test making
use of a combination of culture and molecular detection methods (Figure 2). Two

479 assumptions should be met for the results of the test to be valid. The first is that 480 Salmonella present in a sample are viable and able to grow in the enrichment conditions being used (medium, incubation temperature, etc.). The second is that the background 481 482 microflora in a sample are not present at abnormally high concentrations (not exceeding 483 10⁵ to 10⁶ CFU/g (Doerscher et al., 2015)), so as to inhibit either the growth of, or the ability to detect, Salmonella. With these assumptions met, we found that Salmonella 484 485 contamination levels greater than 5 CFU/g can be detected in GBE at 4h with 100% 486 sensitivity (i.e. the molecular tests did not fail to detect any samples contaminated at 487 this level) and 83% (BAX) to 93% (3M) specificity (i.e. the ability of the molecular tests 488 to accurately identify a sample as being contaminated at the 5CFU/g level at the 489 indicated timepoint, with some samples actually contaminated at lower levels being 490 misclassified as more highly contaminated). The use of direct plating of enrichment 491 samples as described provides confirmation of estimated of counts, evidence of pathogen viability (by comparing results at T0 to later timepoints), and the opportunity to 492 493 further characterize Salmonella isolates. Additional research is needed to determine the value of the TTP method for estimating Salmonella levels in naturally contaminated 494 products, and to more thoroughly examine the impact of variation in growth rate of 495 496 different Salmonella strains on time to detection. However, this rapid, semi-quantitative 497 approach has the potential to identify highly contaminated products before they enter the food chain. Use of this approach could positively impact human health, by 498 499 decreasing exposure to higher Salmonella levels more likely to cause disease. 500

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- 505 providing specific information and does not imply recommendations or endorsement by
- the USDA. The USDA is an equal opportunity provider and employer.
- 507
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641

642 Table and figure legends

643

- 644 **Table 1**
- 645 *Salmonella* strains used and average growth rates observed in GBE and mTSB at 42°C.

646 DT is doubling time in min; Delta (Δ) DT is the difference in DT between mTSB and

647 GBE.

648

649 **Table 2**

650 *Salmonella* Mean Log initial CFU/g and corresponding CFU/ml in GBE at the given

timepoints, along with percent of samples found positive with the detection methods

652 indicated. Values in bold indicate concentration and timepoint where all methods

653 detected *Salmonella* present.

654

655 **Table 3**

Summary of detection limits of the IMS, BAX and 3M tests used to detect Salmonella in 656 657 GBE. A total of 236 enrichment samples where Salmonella was detected by any of the 658 three methods used, were grouped by Salmonella concentration (log CFU/ml) as determined by the culture methods described. The number of samples in each group 659 660 (n), mean log CFU/ml and standard deviation (SD) are reported, as well as the percent of samples in each category, found positive by the detection method indicated. The heat 661 map highlights the Salmonella log ranges where the detection methods used 662 demonstrated greater variability in performance (dark grey). Bold text indicates the log 663

range where all detection methods used consistently identified the presence of*Salmonella*.

666

667 **Table 4**

Performance measures for the time-to-positivity (TTP) model to predict estimated *Salmonella* CFU/g in ground beef. Presence of *Salmonella* was assayed using two
molecular tests (BAX and 3M) and the timepoints (T in hours) evaluated are listed.

671

672 Figure 1

Violin plot depicting distribution of initial *Salmonella* contamination level (log CFU/g) in ground beef, by timepoint first detected positive with either the BAX (1A) or the 3M (1B) detection assays. Inset of 1A. shows the observed log CFU/g starting concentrations for the 56 inoculated ground beef samples, grouped and colored by log range, with red log 1.0 (n=13), orange log 0.0 (n=14), yellow log -1.0 (n=14), and green log -2.0 (n=15). The tables below each graph summarize the initial mean log CFU/g, 95% confidence interval, min and max values within each timepoint positive category.

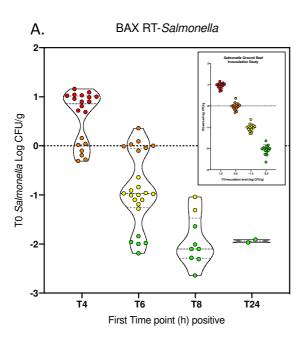
680

681 **Figure 2**

Summary of time-to-positivity (TTP) method for estimating *Salmonella* contamination
level in ground beef. Estimated level of *Salmonella* can be determined within 10 to 12 h.
Culture confirmation of estimated counts using EB Petrifilm[™] replicaplated to XLD can
be completed within 48 to 72h.

Figure S1. Depiction of the EB Petrifilm[™] replicaplate method for the estimation of *Salmonella* counts using XLD medium. The XLD plates in panels 4A. and 4B. show the
results post replica plating and incubation, with 4A. showing a majority of non-*Salmonella* colonies (yellow) and 4B. showing a majority of *Salmonella* colonies (black)
on the agar plate.





T4

20 0.58

-0.31

1.16

T6

24 -0.90

-2.19

0.36

Т8

9 -1.94

-2.64

-1.04

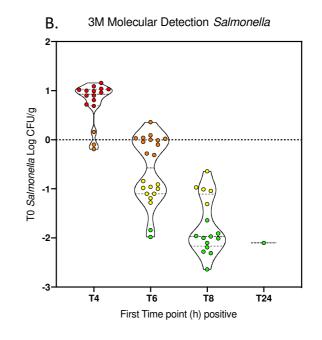
0.33, 0.83 -1.22, -0.58 -2.33, -1.54 -2.32, -1.56

T24

2 -1.94

-1.97

-1.91



3M	T4	Т6	Т8	T24
n	16	22	16	1
Mean TO Log CFU/g	0.76	-0.61	-1.75	-2.10
95% CI (lower, upper)	0.54 , 0.99	-0.90 , -0.31	-2.06 , -1.44	-
min Log CFU/g	-0.19	-1.98	-2.64	-2.10
max Log CFU/g	1.16	0.36	-0.64	-2.10

694

BAX

n Mean TO Log CFU/g 95% CI (lower, upper)

min Log CFU/g

max Log CFU/g

- 695
- 696
- 697
- 698

- 699
- 700
- 701
- 702 Figure 2.

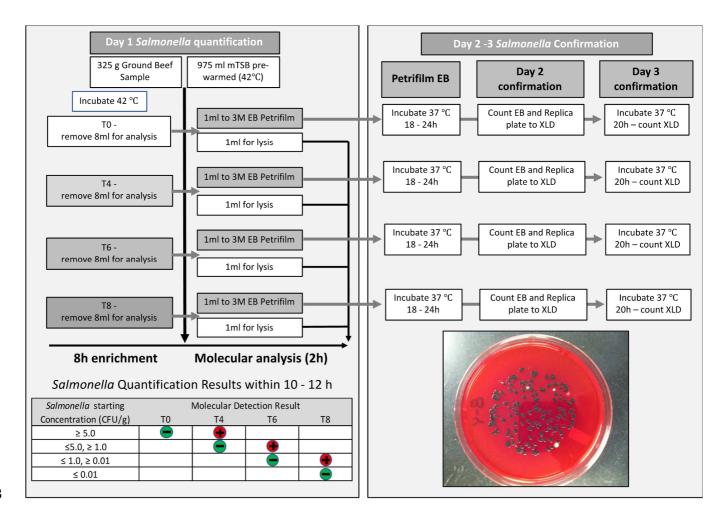


Table 1.

			Isolation	DT (min) at 42°C ^a		
	Serotype	Strain	Source	GBE (SD)	mTSB (SD)	∆DT
	Newport	N39	Bovine	13.4 (1.04)	17.9 (0.53)	4.5
	Enteritidis	95-14327	Human	14.2 (2.01)	19.8 (0.25)	5.6
F	Anatum	A29	Bovine	15.1 (0.99)	18.9 (0.53)	3.8
FAST	Typhimurium (1,4,[5],12:i:-)	3-H79	Bovine	16.2 (0.88)	20.2 (1.18)	4.0
ш	Typhimurium ^b	T36	Bovine	16.5 (1.17)	20.3 (1.18)	3.8
	Anatum	08-1092	Human	16.6 (0.23)	19.0 (0.56)	2.4
	Montevideo	2012K-1544	Human	16.8 (0.87)	19.8 (0.52)	3.0
	Average			15.5 ^{ce} (1.58)	19.4 ^{<i>cf</i>} (1.06)	3.9 ^{<i>g</i>}
	Newport	2010K-2159	Human	17.2 (1.31)	19.6 (0.72)	2.4
	Enteritidis	95-2876	Human	18.5 (1.34)	22.4 (2.21)	3.9
≥	Dublin	SM73-2	Bovine	19.3 (1.00)	21.4 (0.58)	2.1
SLOW	Dublin	5-75-E	Bovine	19.3 (0.98)	20.9 (1.34)	1.6
S	Newport	N17	Bovine	19.9 (1.09)	19.0 (0.42)	-0.9
	Montevideo ^b	H06	Human	20.6 (1.27)	20.6 (1.85)	0.0
	Typhimurium	14028S	Human	22.9 (2.08)	26.9 (1.96)	4.0
	Average			19.5 ^{de} (1.95)	21.4 ^{df} (2.68)	1.8 ^{<i>g</i>}

^a Average T0 inoculum was 0.89 CFU/g (95% CI = 0.69 - 1.08)

^b Salmples incubated at 37°C not 42°C

Two-tailed, unpaired t-test of statistical significance with $P \le 0.05$ defined as significantly different.

Common superscript indicates values evaluated and outcome as follows: ^cYes, P < 0.0001; ^dYes, P = 0.0358; ^eYes, P = 0.0004; ^fNo, P = 0.0632; ^gYes, P = 0.0272

Table 2.

			Mean log				
	Mean initial	Enrichment	Salmonella		% IMS	% BAX	% 3M
Contamination level	level	Timepoint	cfu/ml	SD	positive	positive	positive
n = 13		Т0	0.47	0.14	76.9	0	0
Mean T0 CFU/g	9.25	T4	3.14	0.42	100	100	100
Mean T0 log CFU/g	0.95	T6	5.25	0.67	100	100	100
lower 95%Cl of mean log	0.86	T8	7.51	0.96	100	100	100
Upper 95%Cl of mean log	1.03	T24	8.60	0.66	100	100	100
n = 14		Т0	-0.49	0.19	7.14	0	0
Mean T0 CFU/g	1.04	T4	2.41	0.33	100	50.0	21.4
Mean T0 log CFU/g	-0.02	Т6	4.28	0.55	100	100	100
lower 95%Cl of mean log	-0.12	T8	6.54	0.94	100	100	100
Upper 95%CI of mean log	0.08	T24	8.49	0.77	100	100	100
n = 14		Т0	-1.49	0.16	0	0	0
Mean T0 CFU/g	0.10	T4	1.47	0.36	92.9	0.0	0
Mean T0 log CFU/g	-1.02	T6	3.42	0.41	100	85.7	64.3
lower 95%Cl of mean log	-1.12	Т8	5.57	0.80	100	100	100
Upper 95%CI of mean log	-0.92	T24	8.12	1.21	100	100	100
n = 15		Т0	-2.54	0.23	0	0	0
Mean T0 CFU/g	0.01	T4	0.61	0.43	66.7	0	0
Mean T0 log CFU/g	-2.07	Т6	2.44	0.47	100	33.3	13.3
lower 95%Cl of mean log	-2.19	Т8	4.42	0.73	100	86.7	86.7
Upper 95%Cl of mean log	-1.94	T24	7.55	1.30	100	100	100

Average Observe Salmonella	d				
log CFU/ml	SD	n	IMS +	3M +	BAX +
0.45	0.24	24	70.8	0.0	0.0
1.39	0.30	19	89.5	0.0	0.0
2.44	0.29	31	100	32.3	51.6
3.46	0.30	31	100	74.2	83.9
4.43	0.34	28	100	96.4	96.4
5.51	0.27	18	100	100	100
6.44	0.25	20	100	100	100
7.52	0.32	25	100	100	100
8.48	0.26	29	100	100	100
9.48	0.20	11	100	100	100

Table 4.

Assay		BAX			3M		
Estimated CFU/g	≥ 5.0	≤ 5.0, ≥ 1.0	≤ 1.0, ≥ 0.01	≥ 5.0	≤ 5.0, ≥ 1.0	≤ 1.0, ≥ 0.01	
TTP	T4	T6	T8	T4	T6	T8	
n	20	35	11	16	39	17	
Sensitivity	100	100	100	100	100	100	
NPV	100	100	100	100	100	100	
False Negative Rate	0	0	0	0	0	0	
Specificity	83.3	39.0	40.0	92.9	56.7	25.0	
PPV (precision)	65.0	29.0	67.0	81.3	40.9	81.2	
Accuracy	87.3	51.0	72.7	94.5	66.7	82.3	
False Positive Rate	16.7	60.7	60.0	7.0	43.0	75.0	