JAST (Journal of Animal Science and Technology) TITLE PAGE

ARTICLE INFORMATION	
Article Type	Research article
Article Title (within 20 words without abbreviations)	Quantitative Risk Assessment of Foodborne *Salmonella* Illness by Estimating Cooking Effect on Eggs from Retail Markets
Running Title (within 10 words)	Risk assessment of *Salmonella* for eggs
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Competing interests	No potential conflict of interest relevant to this article was reported.
Funding sources State funding sources (grants, funding sources, equipment, and supplies). Include name and number of grant if available.	This research was supported by a grant (18162KFDA525) from the Korea Food and Drug Administration in 2020.
Acknowledgements	Not applicable
Availability of data and material	Upon reasonable request, the datasets of this study can be available from the corresponding author.
Authors' contributions Please specify the authors' role using this form.	Conceptualization: Yoon Y. Lee S. Lee H. Data curation: Oh H. Lee S. Oh SW Formal analysis: Lee H. Oh H. Methodology: Oh H. Oh SW, Yoon JW. Validation: Yoon Y. Lee H. Investigation: Yoon JW, Yoon Y. Writing - original draft: Oh H, Writing - review & editing: Oh H, Yoon Y, Yoon JW, Oh SW, Lee S, Lee H.

Ethics approval and consent to participate	This article does not require IRB/IACUC approval because there are no human and animal participants.

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Abstract

In this study, we performed a quantitative microbial risk assessment (QMRA) of *Salmonella* through intake of egg consumption after cooking (dry-heat, moist-heat, and raw consumption). Egg samples (n=201) from retail markets were analyzed for the presence of *Salmonella* spp. In addition, temperature and time were investigated during egg transit, storage, and display. The development of predictive models to characterize the kinetic behavior of *Salmonella* in eggs and the collection of data on the amount and frequency of egg consumption. The data was simulated to estimate egg-related foodborne illnesses. *Salmonella* was not found in any of the 201 egg samples that were tested for it. Thus, the estimated initial contamination level was –4.0 Log CFU/g. With R^2 values of 0.898 and 0.922, respectively, the constructed prediction models were adequate for explaining the fate of *Salmonella* spp. in eggs throughout distribution and storage. Eggs were consumed raw (1.5%, 39.2 g), dry-heated (57.5%, 43.0 g), and moist-heated (41%, 36.1 g). The probability of foodborne *Salmonella* illness from the consumption of cooked eggs was evaluated to be 6.8×10^{-10}. Additionally, the probability of foodborne illness not applied cooking methods was 1.9×10^{-7}, indicating that *Salmonella* can be reduced by cooking. Therefore, the risk of *Salmonella* infection through consumption of eggs after cooking is low in S. Korea.

Key words: Eggs, *Salmonella,* QMRA, Cooking method, Food safety

Introduction

Salmonella is harmful bacteria that causes foodborne illness in sensitive consumers like the elderly (>65 years old), children (<5 years old), pregnant women, and immune weakened people [1]. *Salmonella* infection can be transmitted by contaminated eggs or chicken meat, as well as transportation, cooking, and serving. After an incubation period of 6 to 48 h, symptoms such as vomiting, diarrhea, and fever occur when contaminated foods are ingested [2-3]. *Salmonella* causes roughly 1.35 million infections, 420 deaths, and 26,500 hospitalizations in the United States, according to the CDC [4]. In 2021, five European Union/European Economic Area (EU/EEA) nations and the United Kingdom (UK) reported 272 confirmed cases. There were two adult male deaths, and twenty-five individuals were hospitalized. 60 of the interviewees specifically mentioned consuming eggs/egg products [5]. In 2020, eggs and egg products are the most common foods linked to *Salmonella,* accounting for 5.3% of all the foodborne *Salmonella* outbreaks [6]. *Salmonella* can transmit an egg either from the inside of a chicken (vertical transmission of the pathogen) or from the outside (horizontal transmission from poultry feces) [7].

Although consumption of raw or incompletely cooked food is associated with the risk of salmonellosis, eggs are consumed either raw or cooked [8]. Salmonellosis is most commonly caused by consuming raw egg products such as sauces and spreads produced with raw eggs (e.g., whipped cream and egg butter), sweets created without an adequate cooking process (e.g., tiramisu, chocolate mousse), and drinks containing raw eggs (e.g., eggnog, raw egg high-protein smoothies) [9]. Avoiding undercooked or raw egg products reduces the risk of *Salmonella* illness [10-11]. As the last line of protection in the food system, consumers' cooking techniques reduce foodborne infections at home [12].

A quantitative microbial risk assessment (QMRA) can quantify risk levels and provide a basis for food safety. In addition, this assessment evaluates the risk probability of foodborne pathogens in food during distribution from final products to consumption with cooking at home [13-14]. Changes in *Salmonella* cell counts by cooking can accurately estimate the *Salmonella* QMRA. In the present study, the reduction of load of *Salmonella* pathogens during cooking was examined, as well as the

consumption frequency and patterns of egg-based-food in order to assess the risk of *Salmonella* illness due to egg consumption. The purpose of this study was to assess the risk of foodborne *Salmonella* illness due to the consuming of raw and cooked egg samples obtained from the markets in Korea.

Materials and Methods

Investigation of *Salmonella* prevalence in eggs and determination of initial contamination level

To monitor *Salmonella* in eggs throughout retail markets in Korea, 201 samples were collected and analyzed from two retail markets and thirteen traditional markets (four in the capital region, two in the Chungcheong region, three in the Gangwon and southwest regions, and one in the southeast region). The isolation and identification method were used to detect *Salmonella* as described by 'Bacteriological test method for eggs' in the Food Code [15]. All of the egg samples were taken in a sterile way and soaked for 10 s in a disinfectant solution containing 250 mL of Lugol's solution (an iodine/potassium iodide solution) and 750 mL of 70% alcohol. The purpose of disinfecting the eggshell is to kill microorganisms on the surface of the eggshell in order to check only the internal contamination of the egg samples [16]. Eggs were taken out to dry, and a piece of an egg was broken into 225 mL of buffered peptone water (BPW; Becton Dickinson and Company, BD, Franklin Lakes, NJ, USA) in a sterile filter bag (3M, St. Paul, MN, USA). The homogenates were then incubated at 36±1°C for 18–24 h after being mixed for 60 s using a BagMixer (Interscience, St. Nom, France). The 0.1-mL aliquot of the enriched suspension was placed into 10 mL of Rappaport–Vassiliadis medium (RV; BD) and incubated for 20-24 h at 42°C. One loop of the incubated RV culture was streaked onto Xylose Lysine Deoxycholate (XLD; BD) agar plates, which were then incubated at 37°C for 24 h. 16s rRNA was used to isolate and identify black *Salmonella*-like colonies with clear membranes. *Salmonella* prevalence data (PR) from eggs were fitted to the beta distribution (α, β), where α is the number of positive samples plus one, and β is one plus the number of positive samples subtracted from the total samples [17]. The initial contamination level (CFU/mL) of *Salmonella* in egg samples was determined using the equation [-LN (1-PR) / mL], originally presented by Sanaa et al. (2004) [18].

Predictive model development

Salmonella *inoculum preparation*

Twelve poultry-isolated *Salmonella* strains (FKS001, FKS002, S2, S15, S22, S30, S39, S46, S50, S56, S66, and S72) and two reference strains (*S.* Typhimurium ATCC 70020 and *S.* Enteritidis ATCC 13076) were cultured at 37°C for 24 h in 10 mL of tryptic soy broth (TSB; BD). Following incubation, 1-mL aliquots of each culture were inoculated into 10 mL of TSB and incubated for 24 h at 37°C. After centrifugation at 1,912 × *g* and 4°C for 15 min, the *Salmonella* bacteria were washed twice with phosphate buffered saline (PBS; 8.0 g NaCl, 1.5 g $NaHPO_4$, 0.2 g KH_2PO_4, and 0.2 g KCl in 1 L distilled water, pH 7.4). To obtain 6 Log CFU/mL of *Salmonella* inoculum, the optical density (OD) of the cell suspensions was adjusted to 2.0 at 600 nm. PBS was used to modify the cell densities so that the strains had similar cell counts. The suspensions were then mixed and used as the inoculum.

Determination of inoculation methods to develop the predictive model

Due to temperature differences between rinsing water and eggs, *Salmonella* can penetrate the shell and infect eggs [19-20]. To confirm the penetration of *Salmonella* into eggs due to the temperature difference, eggs at 42°C, which is the body temperature of poultry, were immersed in 8–9 Log CFU/mL of *Salmonella* inoculum at 4°C for 1 min and then dried for 30 min. Additionally, 0.1 mL of the inoculum was added to the egg yolks and whites to confirm *Salmonella* growth. The samples were microbiologically examined after seven days at 15°C. 10 mL of 0.1% BPW was put into each infected egg yolk and egg white and pounded for 10 s with a BagMixer. The homogenates were then serially diluted in 9 mL of 0.1% BPW, and 0.1-mL aliquots were spread-plated on XLD. XLD plates were incubated at 37°C for 24 h under aerobic conditions.

Development of predictive models

To develop prediction models of *Salmonella* in eggs, each egg was directly injected into the egg yolk with 2–3 Log CFU/g of *Salmonella* inoculum and the injection holes were sealed. Infected eggs were stored at 7, 15, 25, and 30°C for 4–7 days. In this investigation, the average weight of the egg samples was 52.5 g. To enumerate the *Salmonella* cells, samples were placed in a sterile filter bag (3M, USA) with 10 mL of 0.1% BPW then pummeled with a BagMixer for 60 s. 0.1-mL aliquots of the diluted homogenates were spread-plated on XLD agar. The plates were inoculated at 37°C for 24 h. *Salmonella* cell counts were fitted to the Baranyi model [21] using DMfit (Institute of Food Research, Norwich, UK) on typical black colonies with clear membranes. Equation:

$$N_t = N_0 + \mu_{max} \times ln\left[1 + \frac{\exp(\mu_{max} \times A_t) - 1}{\exp(N_{max} - N_0)}\right]$$

$$A_t = t + \frac{1}{\mu_{max}} ln\left(\frac{\exp(-\mu_{max}) + q_0}{1 + q_0}\right)$$

$$q_0 = \frac{1}{\exp(h_0) - 1}$$

The polynomial model was fitted to $\sqrt{\mu_{max}}$ and *LPD* values to determine how storage temperature affected the kinetic parameters.

$$LPD = a_0 + a_1 T^1 + a_2 T^2 \quad \text{and} \quad \sqrt{\mu_{max}} = a\ (T - T_{min})$$

where a_i is the coefficient value, and T is storage temperature (°C). Additional experiments at 10 and 20°C assessed the model's performance. For the observed values, *Salmonella* cells were counted during storage. The root mean square error (*RMSE*), bias factor (B_f), and accuracy factor (A_f) [22] were calculated to quantify the differences between the observed values and predicted data resulting from the constructed predictive models at 10 and 20°C:

$$RMSE = \sqrt{\sum(predicted\ \ value - observed\ \ value)^2/n}$$

$$B_f = 10^{(\Sigma\, Log(predicted/observed)/n)}$$

$$A_f = 10^{(\Sigma|Log(predicted/observed)|/n)}$$

where n is the total number of data points.

125 **Evaluation of effect of cooking methods on reduction of *Salmonella* cell counts**

126 Representative cooking methods for eggs have been investigated in previous studies [23-24]. The
127 conditions of cooking time and temperature according to the cooking method [dry heat (fried), moist
128 heat (boiled, steamed, and poached), and raw (whipping cream and butter cream)] were investigated,
129 and appropriate or inappropriate cooking times were applied. *Salmonella* inoculum was put into each
130 egg at 3–4 Log CFU/g to investigate cooking methods' *Salmonella* reduction. The whipping cream and
131 butter cream were prepared using raw eggs. Whipping cream is made by mixing egg yolk with milk,
132 while butter cream is prepared by mixing egg white and butter. In this study, the whipping cream and
133 butter cream inoculated with *Salmonella* were prepared and refrigerated for seven days. Appropriate
134 cooking at dry and moist heat, which completely kills *Salmonella* inoculated into egg yolk, was
135 performed for at least 1 min after reaching an internal temperature of 74°C [25]. When the internal
136 temperature did not reach 74°C, the eggs were undercooked, and that duration was considered
137 inappropriate cooking time. These effects on the reduction in *Salmonella* cell counts were included as
138 input variables in the simulation model.

139

140 **Investigation of egg storage conditions and consumption data**

141 The temperature and time spent transporting, storing, and displaying of eggs in retail markets were
142 obtained through communication with managers in retail markets and from previous studies [26-27].
143 The 24 h recall data from the 2016 Korea National Health and Nutrition Examination Survey (KNHNES)
144 was used to calculate the daily consumption amounts and ratios of eggs. Using SAS® (Version 9.3, SAS
145 Institute Inc., Cary, NC, USA), we analyzed the raw data. The egg consumption ratio was determined
146 by dividing the total number of survey respondents (7,042 people) by the number of respondents who
147 consumed eggs (4,230 people). @Risk (Palisade Corp, Ithaca, NY, USA) was used to analyze the
148 collected temperature, time, and consumption data to determine proper probabilistic distributions.

149

150 **Model of dose-response and risk characterization**

In previous data, we searched for a dose-response model to assess *Salmonella* exposure after consuming infected eggs. The MRA scenario was constructed according to Figure 1. The initial *Salmonella* infection level in eggs, prediction models, probabilistic distributions for time and temperature from markets to homes, probabilistic distribution of consumption data, reduction rate by cooking methods, and a dose-response model were used to create a simulation model in Excel® (Microsoft Corp, Seattle, WA, USA). Monte Carlo simulation with @Risk was used to calculate egg-borne *Salmonella* risk.

Results and Discussion

Salmonella prevalence and initial contamination level

Salmonella cell counts in all 201 egg samples were below the detection limit (0.1 Log CFU/g). Furthermore, Mahdavi et al. (2012) [28] found no *Salmonella* in 525 egg samples, and Safaei et al. (2011) [29] identified no *Salmonella*, *Listeria monocytogenes*, or *Campylobacter jejuni* contamination in 100 eggs. Other investigations found 0.1–1.6% *Salmonella* infection in commercial eggs [30-32]. Since no *Salmonella*-positive samples were included in this study, the Beta distribution (RiskBeta (1, 202)) was used to assess the prevalence of *Salmonella* in eggs. In addition, initial contamination levels were determined to be –4.0 Log CFU/g (Figure 2).

Predictive *Salmonella* kinetic model

Due to the temperature difference between rinsing water and eggs, *Salmonella* can enter the shell at rates of almost 2 Log CFU/g. However, the standard rinsing water temperature must be 5°C higher than the egg temperature. If 150 ppm of sodium hypochlorite solution or a disinfectant with equivalent efficacy is used in rinsing water [15], no penetration of *Salmonella* through the egg shell is observed. *Salmonella* cells were inoculated into egg yolk or egg white and stored at 15°C for 7 d. *Salmonella* cell counts in egg yolk samples increased, but egg whites did not show growth of *Salmonella* (data not shown). Therefore, egg yolk was selected for development of predictive models. *Salmonella*-infected

eggs were used to develop these models, and they were stored at temperature of 7, 15, 25, and 30°C during storage. The optimal temperature for *Salmonella* growth is between 10 to 30°C, however it can survive at 7°C. The primary models were used to obtain the kinetic parameters (*LPD* and $\sqrt{\mu_{max}}$), which are listed in Table 1. *LPDs* reduced (p<0.05) from 22.2 to 1.4 h as the temperature increased (Table 1), demonstrating that *Salmonella* can grow quickly in eggs when the storage temperature increases. A polynomial model was used to assess how temperature affects *LPD* and $\sqrt{\mu_{max}}$ values. Figure 3 illustrates the secondary models. Due to the relatively high R^2 values, the secondary models were appropriate for characterizing the association between temperature and *LPD* (R^2=0.898) and $\sqrt{\mu_{max}}$ (R^2=0.922) values. In model performance validation, the *RMSE* values at 10 and 20°C were 0.176 and 0.294, respectively. B_f and A_f were respectively 0.97 and 1.07 at 10°C and 0.98 and 1.06 at 20°C. These finding suggested that the developed models are suitable for predicting the number of *Salmonella* cells in eggs during storage.

Effects of cooking methods on reducing *Salmonella* cell counts

Salmonella decreased by 2.1±0.1 Log CFU/g in whipping cream and by 1.4±0.0 Log CFU/g in butter cream after seven days (Figure 4A and 4B). When the *Salmonella*-inoculated (3.8±0.4 Log CFU/g) eggs were steamed, *Salmonella* was not detected in a microwave for 1 min (Figure 4C). When *Salmonella*-contaminated (3.8±0.4 Log CFU/g) eggs were boiled, *Salmonella* was not detected after 6 min. When eggs were boiled for 4 min, only the surface of the egg yolk was cooked. Thus, *Salmonella* remained and was detected when the egg yolk was cooked for 4 min or less (Figure 4D). Poached eggs are eaten by pouring hot broth into the eggs and cooking slightly. Although hot broth (100°C) was poured, 0.2 Log CFU/g of *Salmonella* was detected after 2 min in poached eggs that were not sufficiently cooked without additional cooking (Figure 4E). When contaminated eggs (3.8±0.4 Log CFU/g) were fried, *Salmonella* was decreased 99.5% and detected at 0.8±0.1 Log CFU/g until 2 min, and *Salmonella* was completely dead after 4 min (complete cooking condition; Figure 4F).

202 **Time and temperature during distribution**

203 Pert distribution (0.5, 4, 9) was used to create a probabilistic distribution for egg transportation
204 from manufacturing plants to the market, which was estimated to take 4 h with a minimum of 30 min
205 and a maximum of 9 h. Park et al. (2017) [26] reported 2.12 and 12.54°C minimum and maximum
206 temperatures during transit to market. Therefore, the transit temperature was fitted to the Uniform
207 distribution (2.12, 12.54) to derive the probability distribution (Table 2). After being transported to the
208 market, eggs were stored at 0–15°C (often at 4°C) for 0–24 h, using the Pert distribution (0, 4, 15) for
209 storage temperature and the Uniform distribution (0, 24) for storage duration. The Uniform distribution
210 was fitted using the parameters (0, 72) after the eggs were displayed at the market for 0-72 h. Eggs were
211 refrigerated and stored at 0–15°C in Korea [15]. To derive the probabilistic distribution for the market
212 display, the Uniform distribution (0, 15) was used (Table 2). Jung (2011) [27] reported that the market-
213 to-home commuting duration and temperature ranged from 10 to 25°C and 0.325 to 1.643 h, respectively.
214 The calculated average transport temperature was 18°C. Thus, the Pert distribution (10, 18, 25) was
215 used to model the transport temperature, while the Uniform distribution (0.325, 1.643) was used to
216 model the transit duration (Table 2). Additionally, the data for at-home storage duration was fitted to
217 the Uniform distribution (0, 540) because eggs were consumed within 540 h (about 3 weeks of shelf
218 life). The temperature of eggs was calculated using the Loglogistic distribution (–29.283, 33.227,
219 26.666, RiskTruncate (–5, 10)) in relation to the temperature of household refrigerators, as described
220 by Lee et al. (2015) [33] (Table 2).

221

222 **Amount and ratio of egg consumption for consumers**

223 The KNHNES [34] raw data on daily egg consumption levels were fitted to @Risk. In S. Korea,
224 the average daily consumption of raw eggs (consumed without additional cooking) was 39.2 g with a
225 consumption frequency of 1.5%. The Weibull distribution [RiskWeibull (1.2556, 41.992, RiskShift
226 (0.067782))] was found to be appropriate for the consumption of raw eggs. The average daily
227 consumption of eggs by dry-heat cooking was 43.0 g by Exponential distribution [RiskExpon (42.896,

RiskShift (0.065791))] at 57.5% of frequency. In addition, the average consumption of eggs by moist-heat cooking was 36.1 g by Exponential distribution [RiskExpon (36.061, RiskShift (–0.016726))] at 41% of frequency. This data indicates that majority of S. Koreans consume eggs daily; nonetheless, the raw egg intake is very low. These results were used to calculate the final contamination level of *Salmonella* based on the ratio of intake patterns, according to the cooking method, and the decreased amount of *Salmonella* after cooking (Table 2).

Dose-response model

The Beta Poisson model $[1-(1+D/\beta)^{-\alpha}]$ evaluated foodborne *Salmonella* illness after egg consumption by cooking method. Teunis et al. (1999) [35] created α=0.89 and β=4.4×10^5, where D is the number of viable *Salmonella* consumed and D (CFU) is determined as *Salmonella* cell count (CFU/g) × consumption amount (g).

Risk characterization

The simulation model was developed using the estimated *Salmonella* contamination level, predictive models simulating *Salmonella* cell counts with probabilistic distributions of temperature and time, probabilistic distributions of consumption amounts, consumption frequency, reduction by cooking, and dose-response model, as shown in Table 2. *Salmonella* cell counts were predicted to have increased gradually from initial contamination (IC; –4.0 Log CFU/g) to home storage (C5; –3.6 Log CFU/g) using the cumulative density calculated by this simulation (Figure 5). *Salmonella* cell counts increased significantly in the market display (C3; –3.7 Log CFU/g) as a result of eggs being sold at 25ºC. The simulation showed that in S. Korea, the daily risk of *Salmonella* infection per person per day from consuming cooked eggs was 6.8×10^{-10} (Table 3). The simulation that did not include cooking procedures revealed that the risk of *Salmonella* infection from egg consuming in S. Korea was 1.9×10^{-7} (2.8×10^2-fold) (Table 3). When fitted without cooking procedures, the risk of foodborne *Salmonella* disease is predicted to be higher. Most people in S. Korea consume eggs that have been cooked in the

form of egg rolls, braised eggs, and egg drop soups. Thus, the scenario which the cooking methods were used was determined to be more realistic and accurate when evaluating the risk of foodborne *Salmonella* disease from egg consumption. Furthermore, raising the raw consumption ratio increased the probability of foodborne *Salmonella* disease compared to the baseline scenario (Table 3). When the raw egg intake ratio was increased to 33%, the probability of foodborne *Salmonella* disease increased 1.6-fold over the baseline prediction (Table 3). When the raw egg consumption ratio was increased to 50%, the probability of foodborne *Salmonella* disease increased by 1.9- to 3.7-fold (Table 3). Uncooked *Salmonella*-contaminated eggs increase the risk of foodborne *Salmonella* outbreaks. In addition, consumption frequency and prevalence increased the risk of foodborne *Salmonella* disease, while raising the cooking time and temperature decreased it (Figure 6).

Conclusion

In conclusion, it appears that the risk of foodborne *Salmonella* disease due to egg consumption in S. Korea was low. In the retail market, *Salmonella* prevalence in eggs is low, and disinfection procedures may reduce or eliminate the risks of contamination by *Salmonella* in the manufacturing step. However, the risk of foodborne *Salmonella* outbreaks increases, if eggs contaminated with *Salmonella* are not cooked. Consequently, consumption of raw eggs was the most influential input factor on risk estimations. Although this QMRA used insufficient data evaluated under certain assumptions, the risk of foodborne *Salmonella* illness can be re-estimated when additional data are collected.

Acknowledgements

This research was supported by a grant (18162KFDA525) from the Korea Food and Drug Administration in 2020.

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370

371

372 **Table 1.** Kinetic parameters calculated by the Baranyi model for *Salmonella* in eggs during storage at

373 7, 15, 25, and 30°C

		Temperature (°C)			
		7	15	25	30
Kinetic parameters	μ_{max}	-0.01±0.01	0.07±0.02	0.20±0.03	0.25±0.10
	LPD	22.18±5.67	9.55±4.96	1.90±0.40	2.10±2.18
N_0		2.1±0.3	2.5±0.4	2.1±0.0	2.1±0.0
N_{max}		1.6±0.2	7.8±0.4	8.1±0.2	8.5±0.3

μ_{max} : maximum specific growth rate (Log CFU/g/h), indicating death and growth rates;

LPD: lag phase duration (h), period of no cell count change in a growth/death curve;

N_0 : initial bacterial cell counts (Log CFU/g)

374

375 **Table 2.** Simulation model and formulas for calculating the risk of *Salmonella* through egg intake prepared by different cooking methods with @Risk

Input model	Unit	Variable	Formula	Reference
PRODUCT				
Pathogens contamination level				
Salmonella prevalence		PR	=RiskBeta(1,202)	This research; [17]
Initial contamination level	CFU/g	C	=-LN(1-PR)/25g	[18]
	Log CFU/g	IC	=Log(C)	
TRANSPORTATION				
Transportation				
Transportation time	h	$Time_{trans}$	=RiskPert(0.5,4,9)	Personal communication[a]; This research
Food temperature during transportation	℃	$Temp_{trans}$	=RiskUniform(2.12,12.54)	[26]
Growth				
		h_0	=Average(*LPD**growth rate), Fixed 0.3198	This research; [21]
	Log CFU/g	Y_0	=Average(Y_{0i}), Fixed 2.2	This research; [21]
	Log CFU/g	Y_{end}	=Average(Y_{endi}), Fixed 6.5	This research; [21]
		ln(q)	=LN(1/(EXP(h_0)-1))	This research; [21]
Growth rate	Log CFU/g/h	GR_{trans}	=IF($Temp_{trans}$>5.30841, (0.0214*($Temp_{trans}$-5.30841))^2, 0)	This research; [21]
Salmonella growth	Log CFU/g	C1	=IC+1/(1+EXP(-ln(q)))*(1-(10$^{-\lvert Y0-Yend \rvert}$/LN(10)))*$GR_{trans}$*$Time_{trans}$	This research; [21]
MARKET				
Market storage				
Storage time	h	$Time_{Mark-st}$	=RiskUniform(0,24)	Personal communication; This research

Food temperature during storage	℃	$Temp_{Mark-st}$	=RiskPert(0,4,15)	Personal communication; This research
Growth				
		h_0	=Average(*LPD**growth rate), Fixed 0.3198	This research; [21]
	Log CFU/g	Y_0	=Average(Y_{0i}), Fixed 2.2	This research; [21]
	Log CFU/g	Y_{end}	=Average(Y_{endi}), Fixed 6.5	This research; [21]
		ln(q)	=LN(1/(EXP(h_0)-1))	This research; [21]
Growth rate	Log CFU/g/h	$GR_{Mark-st}$	=IF($Temp_{Mark-st}$>5.30841, (0.0214*($Temp_{Mark-st}$-5.30841))^2, 0)	This research; [21]
Salmonella growth	Log CFU/g	C2	=C1+1/(1+EXP(-ln(q)))*(1-($10^{-\lvert Y0-Yend \rvert}$/LN(10)))*$GR_{Mark-st}$*$Time_{Mark-st}$	This research; [21]
Market display				
Display time	h	$Time_{Mark-dis}$	=RiskUniform(0,72)	Personal communication; This research
Food temperature during display	℃	$Temp_{Mark-dis}$	=RiskUniform(0,15)	Personal communication; This research
Growth				
		h_0	=Average(*LPD**growth rate), Fixed 0.3198	This research; [21]
	Log CFU/g	Y_0	=Average(Y_{0i}), Fixed 2.2	This research; [21]
	Log CFU/g	Y_{end}	=Average(Y_{endi}), Fixed 6.5	This research; [21]
		ln(q)	=LN(1/(EXP(h_0)-1))	This research; [21]
Growth rate	Log CFU/g/h	$GR_{Mark-dis}$	=IF($Temp_{Mark-dis}$>5.30841, (0.0214*($Temp_{Mark-dis}$-5.30841))^2, 0)	This research; [21]
Salmonella growth	Log CFU/g	C3	=C2+1/(1+EXP(-ln(q)))*(1-($10^{-\lvert Y0-Yend \rvert}$/LN(10)))*$GR_{Mark-dis}$*$Time_{Mark-dis}$	This research; [21]
TRANSPORTATION (vehicle)				
Transportation				
Transportation time	h	$Time_{Veh}$	=RiskUniform(0.325,1.643)	[27]

Food temperature during storage	°C	$Temp_{Veh}$	=RiskPert(10,18,25)	[27]
Growth				
		h_0	=Average(*LPD**growth rate), Fixed 0.3198	This research; [21]
	Log CFU/g	Y_0	=Average(Y_{0i}), Fixed 2.2	This research; [21]
	Log CFU/g	Y_{end}	=Average(Y_{endi}), Fixed 6.5	This research; [21]
		ln(q)	=LN(1/(EXP(h_0)-1))	This research; [21]
Growth rate	Log CFU/g/h	GR_{Veh}	=IF($Temp_{Veh}$>5.30841, (0.0214*($Temp_{Veh}$-5.30841))^2, 0)	This research; [21]
Salmonella growth	Log CFU/g	C4	=C3+1/(1+EXP(-ln(q)))*(1-($10^{-\lvert Y0-Yend \rvert}$/LN(10)))*$GR_{Veh}$*$Time_{Veh}$	This research; [21]
HOME				
Home storage				
Storage time	h	$Time_{Home}$	=RiskUniform(0,540)	Personal communication; This research
Food temperature during storage	°C	$Temp_{Home}$	=RiskLogLogistic(-29.283,33.227,26.666,Risktruncate(-5,10))	[33]
Growth				
		h_0	=Average(*LPD**growth rate), Fixed 0.3198	This research; [21]
	Log CFU/g	Y_0	=Average(Y_{0i}), Fixed 2.2	This research; [21]
	Log CFU/g	Y_{end}	=Average(Y_{endi}), Fixed 6.5	This research; [21]
		ln(q)	=LN(1/(EXP(h_0)-1))	This research; [21]
Growth rate	Log CFU/g/h	GR_{Home}	=IF($Temp_{Home}$>5.30841, (0.0214*($Temp_{Home}$-5.30841))^2, 0)	This research; [21]
Salmonella growth	Log CFU/g	C5	=C4+1/(1+EXP(-ln(q)))*(1-($10^{-\lvert Y0-Yend \rvert}$/LN(10)))*$GR_{Home}$*$Time_{Home}$	This research; [21]
	CFU/g	$C5_{CFU/g}$	$=10^{C5}$	
CONSUMPTION				
Daily consumption frequency for eggs	%	ConRatio	Fixed 60.1	[34][b]
		CR(0)	=1-(60.1/100)	[34]
		CR(1)	=60.1/100	[34]

		CR	=RiskDiscrete({0,1},{CR(0),CR(1)})	[34]
COOKING METHOD				
Dry heat cooking		Cook(dry)	=57.5/100	[34]
Moist heat cooking		Cook(moist)	=41/100	[34]
Raw (uncooked)		Cook(raw)	=1.5/100	[34]
		Cook	=RiskDiscrete({1,2,3}, {Cook(dry), Cook(moist), Cook(raw)})	
Consumption by dry heat cooking	g	$Consump_{dry-cook}$	=RiskExpon(42.896,RiskShift(0.065791),RiskTruncate(0.08,360))	This research; [34]
Consumption by moist heat cooking	g	$Consump_{moist-cook}$	=RiskExpon(36.061,RiskShift(-0.016726),RiskTruncate(0,340))	This research; [34]
Consumption by raw	g	$Consump_{raw}$	=RiskWeibull(1.2556,41.992,RiskShift(0.067782),RiskTruncate(0.32,153.9))	This research; [34]
	g	Consump	=IF(Cook=1,$Consump_{dry-cook}$, IF(Cook=2,$Consump_{moist-cook}$, IF(Cook=3,$Consump_{raw}$)))	
Total consumption	g	Amount	=IF(CR=0,0,Consump)	
REDUCTION				
Dry heat cooking		$Reduce_{(dry)}$	=57.5/100	[34]
Moist heat cooking		$Reduce_{(moist)}$	=41/100	[34]
Raw (uncooked)		$Reduce_{(raw)}$	=1.5/100	[34]
		Reduce	=RiskDiscrete({1,2,3}, {Reduce(dry), Reduce(moist), Reduce(raw)})	
Reduce(dry) -dry heat cooking				
Cooking time	h	$Time_{dry-cook}$	=RiskPert(0.03,0.07,0.1)	This research
Food temperature during cooking	^oC	$Temp_{dry-cook}$	=RiskPert(74*0.8,74,74*1.2)	This research; [36]
	CFU/g	$Reduce_{dry-cook}$	=IF(AND($Temp_{dry-cook}$>74,$Time_{dry-cook}$>0.07),0,$C5_{CFU/g}$*0.01)	
Reduce(moist) -moist heat cooking				
Cooking time	h	$Time_{moist-cook}$	=RiskPert(0.03,0.07,0.25)	This research
Food temperature during cooking	^oC	$Temp_{moist-cook}$	=RiskPert(74*0.8,74,74*1.2)	This research; [36]

	CFU/g	$Reduce_{moist\text{-}cook}$	=IF(AND($Temp_{moist\text{-}cook}$>74,$Time_{moist\text{-}cook}$>0.07),0,$C5_{CFU/g}$*0.01)	
Reduce(raw) -raw				
Cooking time	h	$Time_{raw}$	=RiskPert(0,0.02,0.03)	This research;
Food temperature during cooking	^oC	$Temp_{raw}$	=RiskUniform(0,60)	This research;
	CFU/g	$Reduce_{raw}$	=IF(AND($Temp_{raw}$>50,$Time_{raw}$>0.02),0,$C5_{CFU/g}$*0.01)	
	CFU/g	Reduction	=IF(Reduce=1,$Reduce_{dry\text{-}cook}$, IF(Reduce=2,$Reduce_{moist\text{-}cook}$, IF(Reduce=3,$Reduce_{raw}$)))	
Final concentration	CFU/g	C6 (Cooked)	=IF(CR=0,0,Reduction)	This research
DOSE-RESPONSE				
Salmonella amount	CFU	D	=C6*Amount	
Parameter of Beta Poisson		α	Fixed, 0.89	[35]
		β	Fixed, $4.4*10^5$	[35]
RISK				
Probability of illness/person/day		Risk	=1-(1+D/β)-α	[35]

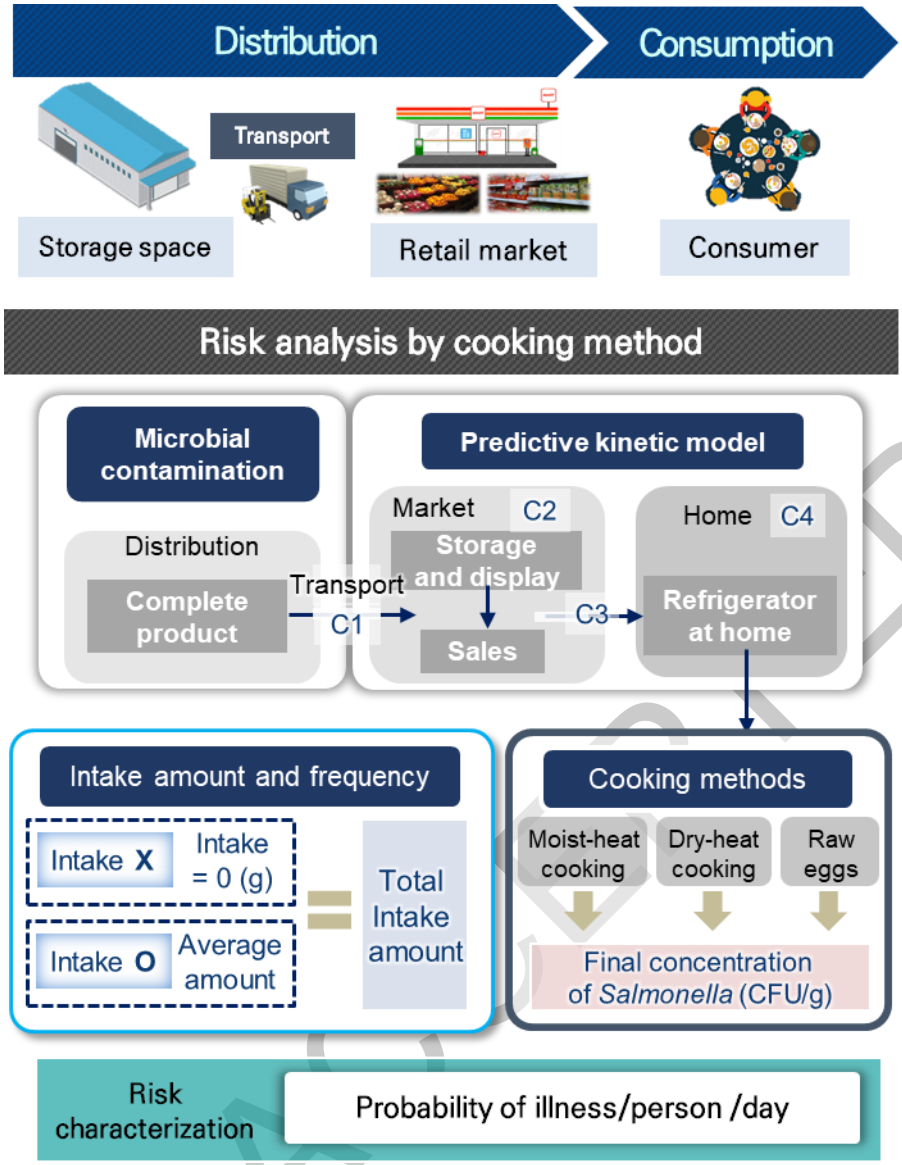
[a] Personal communication with manager in charge of products at retail store
[b] Korea Disease Control and Prevention Agency

376 **Table 3.** Probability of *Salmonella* foodborne illness per person per day with different scenarios in the eggs cooking methods and ratios

Scenario	Mean	Fold change
Baseline (applied cooking)	6.8×10^{-10}	-
1. Not applied cooking	1.9×10^{-7}	2.8×10^{2} ↑
2. 33% of raw consumption	1.1×10^{-9}	1.6 ↑
3. 50% of raw consumption with 50% dry-heat cooking	1.3×10^{-9}	1.9 ↑
4. 50% of raw consumption with 50% moist-heat cooking	2.5×10^{-9}	3.7 ↑

377

378 **Figure 1.**



379 **Figure 1.** Scheme of *Salmonella* risk assessment in eggs.

Figure 2.

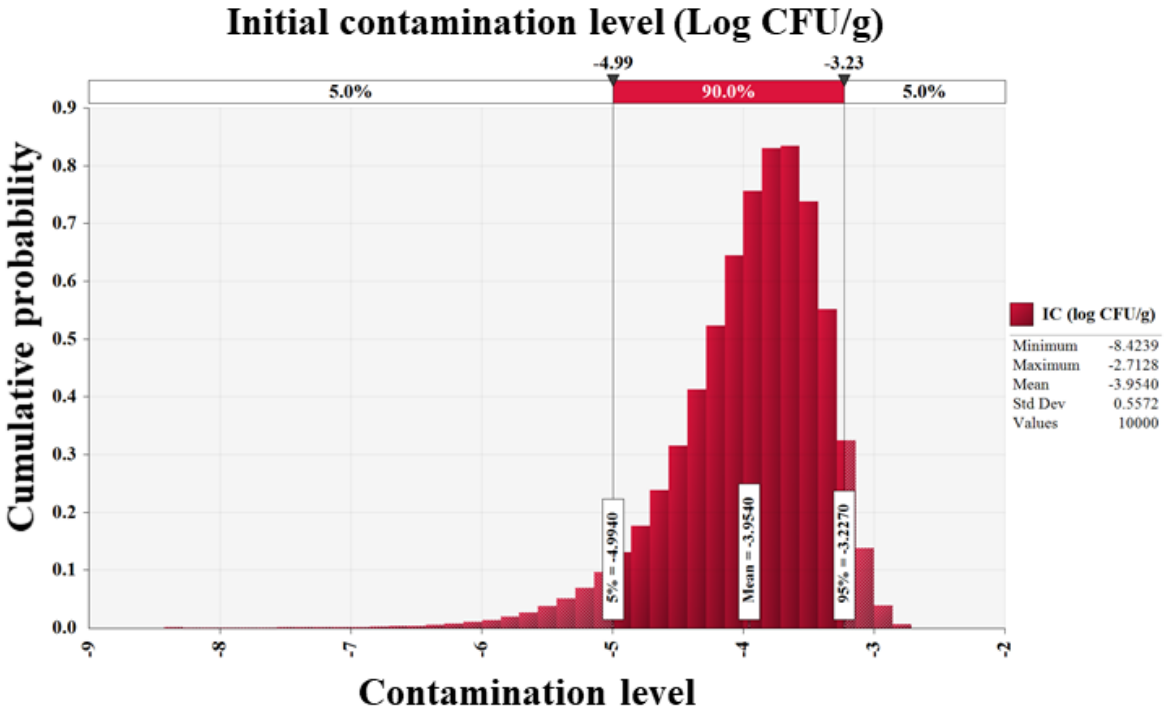
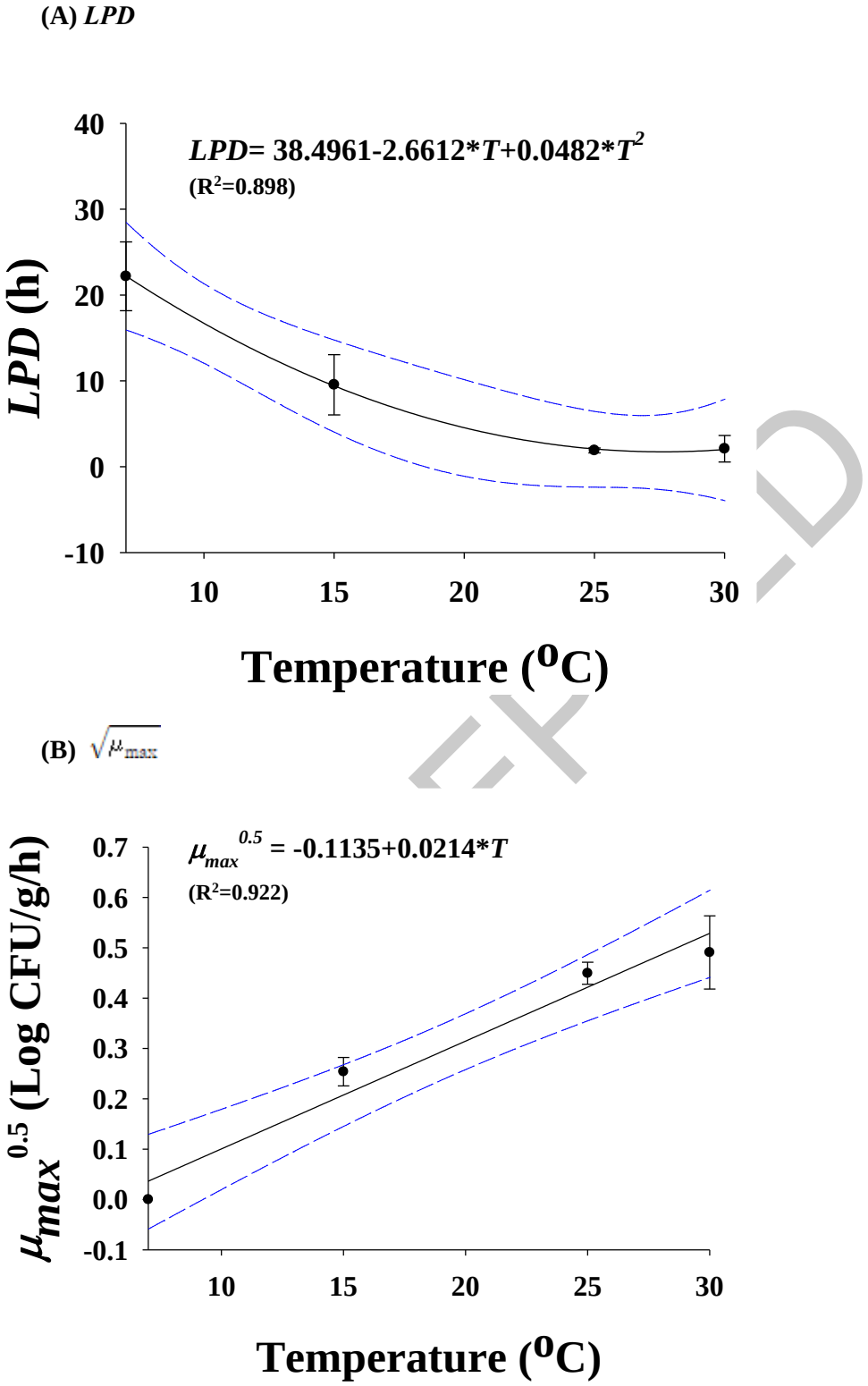


Figure 2. Probability density for initial contamination level of *Salmonella* in eggs.

385 **Figure 3.**

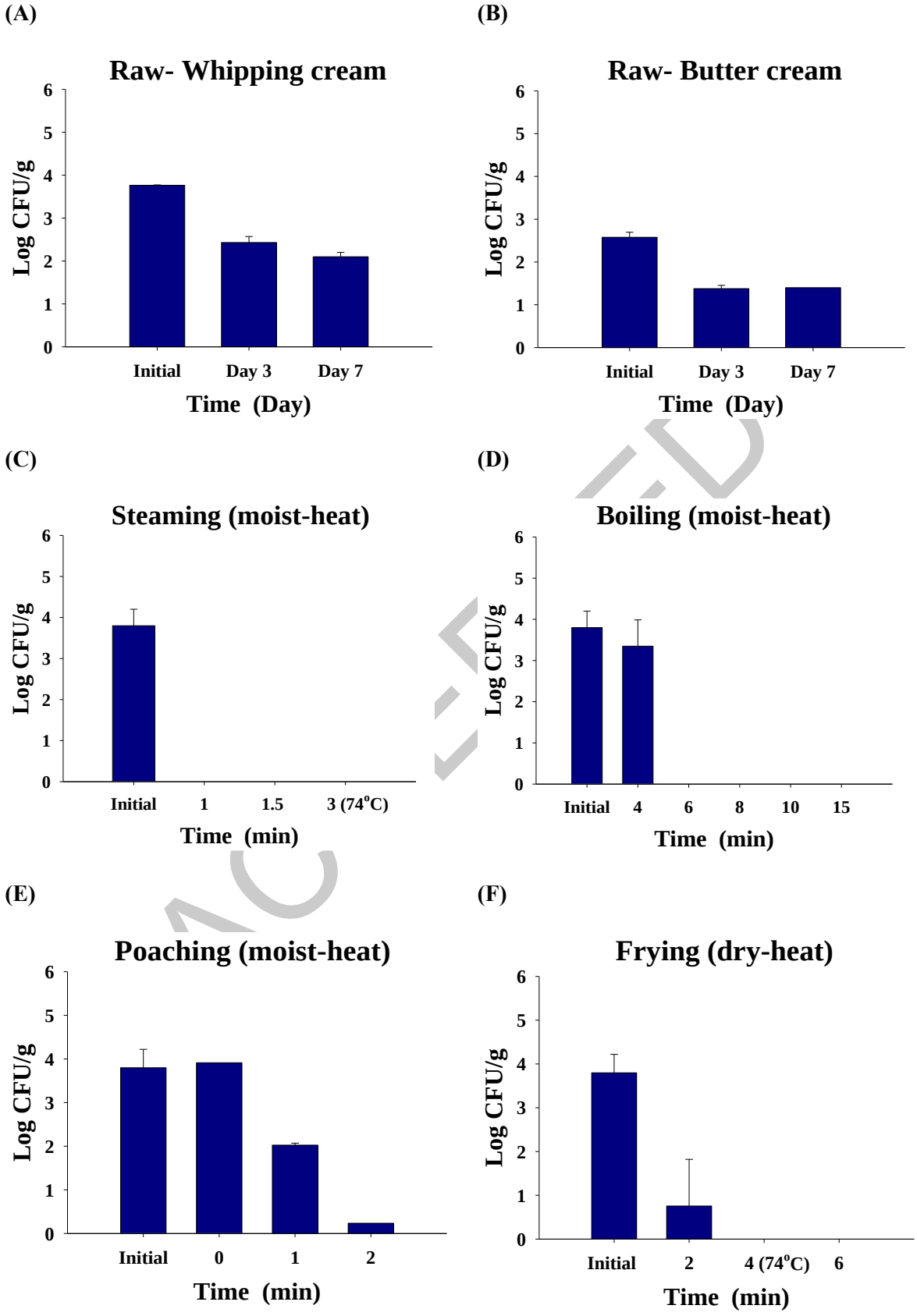


386 **Figure 3.** Secondary model for lag phase (A) and growth rate (B) of *Salmonella* in eggs as a function

387 of storage temperature. Symbol, observed value; line, fitted line with the polynomial model.

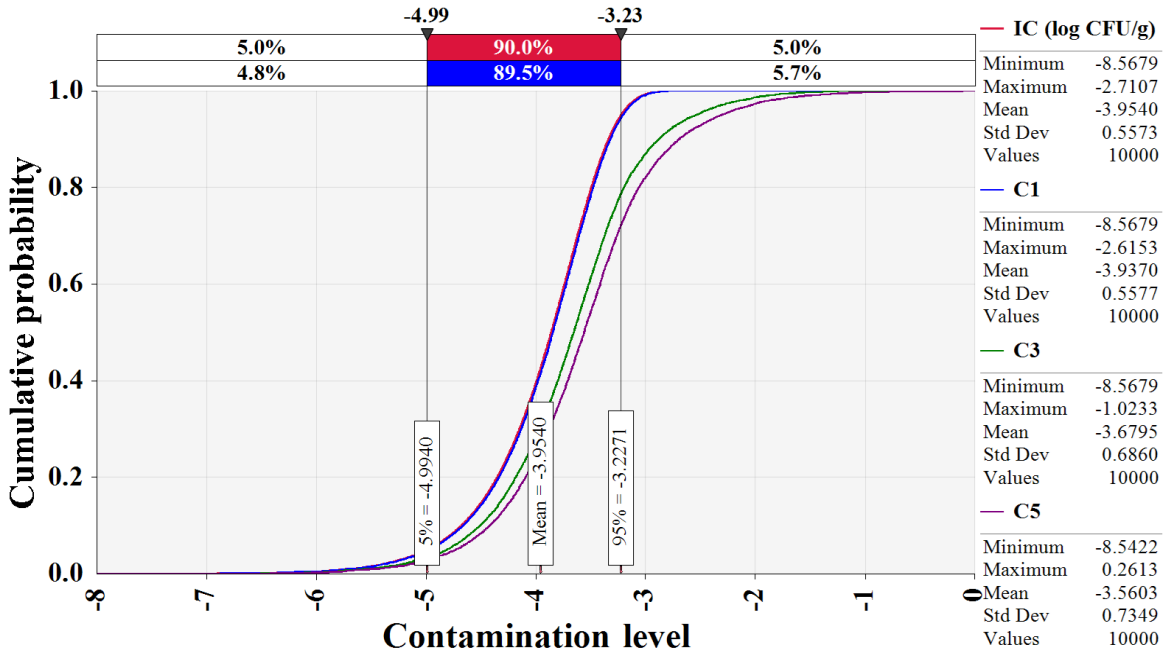
388

389 **Figure 4.**



390 **Figure 4.** Reduction of *Salmonella* cell counts by cooking methods (raw, moist-heating, and dry-heating)

391 **Figure 5.**



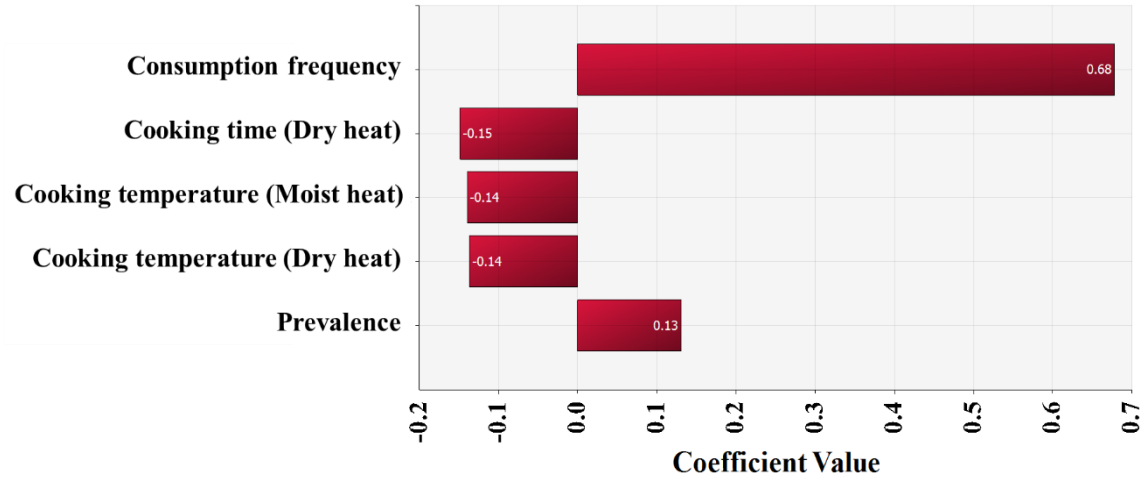
392

393 **Figure 5.** Changes in *Salmonella* contamination levels in eggs predicted by distributions during

394 transportation, storage, and display in retail market

395

396 **Figure 6.**



397 **Figure 6.** Correlation coefficients for risk factors affecting the probability of *Salmonella* illness per

398 person per day by eggs consumption

399