#### ORIGINAL RESEARCH

#### Food Science & Nutrition

WILEY

# Contamination of *Clostridium perfringens* in soy sauce, and quantitative microbial risk assessment for *C. perfringens* through soy sauce consumption

## Yeongeun Seo<sup>1</sup> $\square$ | Yewon Lee<sup>1</sup> $\square$ | Sejeong Kim<sup>2</sup> $\square$ | Jimyeong Ha<sup>2</sup> $\square$ | Yukyung Choi<sup>2</sup> $\square$ | Hyemin Oh<sup>2</sup> $\square$ | Yujin Kim<sup>1</sup> $\square$ | Min Suk Rhee<sup>3</sup> $\square$ |

<sup>1</sup>Department of Food and Nutrition, Sookmyung Women's University, Seoul, Korea

Yohan Yoon<sup>1,2</sup>

<sup>2</sup>Risk Analysis Research Center, Sookmyung Women's University, Seoul, Korea

<sup>3</sup>Department of Biotechnology, College of Life Sciences and Biotechnology, Korea University, Seoul, Korea

#### Correspondence

Yohan Yoon, Department of Food and Nutrition, Sookmyung Women's University, Seoul 04310, Korea. Email: yyoon@sookmyung.ac.kr

#### **Funding information**

Ministry of Food and Drug Safety, Grant/ Award Number: 17162KFDA035

#### Abstract

The objective of this study was to conduct QMRA (quantitative microbial risk assessment) of Clostridium perfringens through soy sauce consumption. Four hundred and ninety soy sauce samples from markets were analyzed to detect C. perfringens. Temperature and time were also measured during transportation and display of soy sauce. A primary model was developed by fitting the Weibull model to the C. perfringens cell counts in soy sauce at 7–35°C, and  $\delta$  (the time needed to decrease 1 log CFU/ ml) and  $\rho$  (curve shape) were calculated. The parameters were analyzed, using the Exponential model (secondary model) as a function of temperature. The consumption amount and percentage of soy sauce were surveyed, and a dose-response model was searched. Using all collected data, a simulation model was prepared in the @RISK program to estimate the probability of C. perfringens foodborne illness by soy sauce consumption. C. perfringens were negative in 490 samples. Thus, the initial contamination level was estimated to be -2.9 log CFU/ml. The developed predictive models showed that C. perfringens cell counts decreased during transportation and display. The average consumption amounts, and the percentage of soy sauce were 7.81 ml and 81.2%, respectively. The simulation showed that the probability of C. perfringens foodborne illness by consumption of soy sauce was  $1.7 \times 10^{-16}$  per person per day. Therefore, the risk of C. perfringens by consumption of soy sauce is low in Korea.

#### KEYWORDS

@risk, *Clostridium perfringens*, dose-response, predictive model, quantitative microbial risk assessment, soy sauce

#### 1 | INTRODUCTION

Soy sauce is one of the seasonings fermented with soy and is consumed in many countries. The annual production of soy sauce in Korea is more than 251,172 t (Ministry of Food & Drug Safety, 2018), and the 13,699 t is exported to the United States, Russia, and China (Korea Agro-Fisheries & Food Trade Corporation, 2018). However, the possibility of *Clostridium perfringens* has been continuously

This is an open access article under the terms of the Creative Commons Attribution License, which permits use, distribution and reproduction in any medium, provided the original work is properly cited. © 2021 The Authors. *Food Science & Nutrition* published by Wiley Periodicals LLC **FV**\_Food Science & Nutrition

raised. C. perfringens is one of the most common causes of foodborne disease outbreak in the United States and Korea, alongside norovirus, Salmonella, Campylobacter, and Escherichia coli (Centers for Disease Control & Prevention, 2017; Ministry of Food & Drug Safety, 2020).

*Clostridium perfringens* are anaerobic bacteria and exist as vegetative cells or spores in food. Cooking (60°C) kill the vegetative cells, but the spores. These spores can germinate into vegetative cells at 20–30°C, which is the temperature for soy sauce storage, and the vegetative cells produce toxin in the intestinal tract (McClane et al., 2012). Hence, the contamination of *C. perfringens* in soy sauce and the risk of *C. perfringens* by soy sauce consumption should be evaluated.

Quantitative microbial risk assessment (QMRA) is a scientific evaluation method for estimating risks caused by microorganisms, including hazard identification, exposure assessment, hazard characterization, and risk characterization. Thus, to estimate the risk of *C. perfringens* contamination in food, QMRA is appropriate (Codex Alimentarius Commission, 2015; Jeong et al., 2018; Lee et al., 2019; WHO, 2002). Also, risk assessment of *C. perfringens* should be assessed through risk assessment based on predictive models. Therefore, the objectives of this study were to investigate the contamination of *C. perfringens* in soy sauce and to evaluate the risk of the pathogen through soy sauce consumption.

#### 2 | MATERIALS AND METHODS

## 2.1 | Investigation of *C. perfringens* contamination in soy sauce

Four hundred and ninety soy sauce samples were purchased from supermarkets in Korea. One milliliter of the soy sauce was spreadplated on tryptose sulfite cycloserine agar (TSC; Difco) plates and incubated at 37°C for 18–24 hr under the anaerobic condition created by an anaerobic pack (Oxoid; Basingstoke) in anaerobic jar. The resulting colonies were analyzed, using a compact VITEK<sup>®</sup>2 ANC ID card (BioMérieux). When the result indicated acceptable or higher, it was determined as positive for *C. perfringens*. The prevalence data of *C. perfringens* were fitted to the Beta distribution ( $\alpha_1$ , the number of positive samples + 1;  $\alpha_2$ , tested total samples-positive samples + 1), and the initial contamination level (CFU/mI) was then evaluated, using the equation: [-LN(1-Beta( $\alpha_1, \alpha_2$ ))/mI] (Sanaa et al., 2004; Vose, 1998).

#### 2.2 | Development of predictive models

*Clostridium perfringens* strains KCCM (Korean Culture Center of Microorganisms) 12098, KCCM40946, KCCM40947, and KCTC (Korean Collection for Type Cultures) 5101 were cultured in 10 ml cooked meat medium (CMM; Oxoid, Basingstoke, Hampshire, UK) at 37°C for 24 hr under the anaerobic conditions. Three-milliliter aliquots of the cultures were inoculated in 30 ml Duncan and

strong medium (15.0 g proteose peptone, 10.0 g sodium phosphate, 4.0 g raffinose, 4.0 g yeast extract, 1.0 g sodium thioglycolate, and 50.0 ml 0.51 mM caffeine in 1 L distilled water) and anaerobically incubated at 37°C for 48 hr. The C. perfringens strains were harvested by centrifugation at  $1,912 \times g$  and  $4^{\circ}$ C for 15 min. The supernatant was discarded, and the cells were washed twice with phosphate buffered saline (PBS; pH 7.4, 8.0 g NaCl, 1.5 g NaHPO<sub>4</sub>, 0.2 g KH<sub>2</sub>PO<sub>4</sub>, and 0.2 g KCl in 1 L distilled water). The cell pellets were resuspended in 3 ml PBS, and the strains were mixed to be used as the inoculum. The C. perfringens inoculum was inoculated to 10 ml soy sauce in a conical tube to achieve a final concentration of 3.0 log CFU/ml, and stored at 7, 15, 25, and 35°C for up to 5 days. During storage, 10 ml of the soy sauce was diluted with 20 ml buffered peptone water (BPW; Dickinson and Company), and it was vortexed. The homogenates were spreadplated on TSC agar, and the plates were incubated anaerobically at 37°C for 24 hr. Typical black colonies with halos were counted, and the C. perfringens cell count data were fitted to the Weibull model. The equation was as follows;

$$\log(N) = \log(N_0) - \left(\frac{\text{time}}{\delta}\right)^{\rho}.$$
 (1)

where N is cell counts, N<sub>0</sub> is initial cell counts,  $\delta$  is treatment time for the first decimal reduction and  $\rho$  is curve shape (Mafart et al., 2002). To describe the effect of temperature on  $\delta$ , a secondary model was developed with the equation as follows;

$$\delta = a \times \exp\left(k \times T\right). \tag{2}$$

Where  $\alpha$  is constant, *k* is the rate constant and *T* is storage temperature. To evaluate the model performance, *C. perfringens* was inoculated in soy sauce as described above, and the samples were stored at 20 and 30°C. During storage, *C. perfringens* cells were counted as described above to obtain the observed values. The differences between the observed data and predicted data derived from the developed predictive models for 20 and 30°C were quantified by calculating the root mean square error (*RMSE*) values, bias factor (*B*<sub>f</sub>), and accuracy factor (*A*<sub>f</sub>) as follows (Ha et al., 2019);

$$RMSE = \sqrt{1/n \times \sum (\text{observed data} - \text{predicted data})^2}.$$
 (3)

ł

$$B_{\epsilon} = 10^{\sum \log (\text{predicted data/observed data)/n}}.$$
(4)

$$A_{f} = 10^{\Sigma \log \text{ predicted data/observed data}}$$
(5)

where *n* represents the number of data points. The *RMSE* is the square root of the variance of the residuals. It indicates the absolute fit of the model to the data-how close the observed data points are to the predicted values. The  $B_f$  shows by how much models over-predict ( $B_f > 1$ ) or underpredict ( $B_f < 1$ ), and  $A_f$  shows by how much the predicted data differ from the observed data (Yoon et al., 2011).



FIGURE 2 Fitted for Clostridium perfringens cell counts in soy sauce with primary models during storage at 7, 15, 25, and 35°C

#### 2.3 | Investigations for soy sauce storage conditions and consumption amounts

The temperature of the transport vehicle was collected by measuring the internal temperature of the transport vehicle of four companies in a retail market. Storage temperature and time data for soy sauce at retails were collected through interviews with managers at retail markets. The transport temperature data were analyzed by @RISK 7.6 (Palisade Corp.) to determine an appropriate probabilistic distribution. To have the daily consumption amounts and percentage for the soy sauce. The data from the Korea National Health and Nutrition Examination Survey 2017 were used. The consumption data were analyzed, using the @RISK 7.6 to determine an appropriate probabilistic distribution. The consumption percentage of soy sauce was calculated by dividing the number of total respondents (6,628 people) in the survey to the number of respondents (5,382 people) who consumed soy sauce.

2141

2142 WILEY

FV\_Food Science & Nutrition

	Temperature (°C)					
Parameters	7	15	25	35		
δ (hr)	91.91 ± 64.91	89.54 ± 14.04	8.89 ± 1.68	$2.44\pm0.65$		
ρ	0.89 ± 0.09	$0.71\pm0.10$	$0.43 \pm 0.01$	$0.18\pm0.02$		

**TABLE 1** Parameters from the Weibullmodel Clostridium perfringens fitted to cellcounts in soy sauce during storage at 7,15, 25, and 35°C

#### 2.4 | Search for dose response model

To evaluate the response of a human to *C. perfringens* dose, when people intake soy sauce contaminated with *C. perfringens* consumption, dose response models were searched through published articles.

#### 2.5 | Preparation of simulation model

A simulation model was then prepared in Excel<sup>®</sup> (Microsoft Corp.) spreadsheet, with the initial concentration of *C. perfringens*, predictive models, probabilistic distributions for the transportation time and temperature used for the predictive models to describe the bacterial growth, a probabilistic distribution of consumption amount, consumption percentage, and the dose-response model. The simulation model eventually calculated the probability of *C. perfringens* foodborne illness by soy sauce consumption per person per day with Monte Carlo simulation in @RISK.

#### 3 | RESULTS AND DISCUSSION

## 3.1 | Prevalence and initial contamination levels of *C. perfringens*

Of 490 samples, *C. perfringens* cell counts were below the detection limit (1 log CFU/ml) in all samples. Because there were no *C. perfringens* positive samples, contamination levels need to be estimated. Thus, the Beta distribution was used to estimate the initial contamination level of *C. perfringens* in soy sauce (Vose, 1998), and the Beta distribution (RiskBeta [1,491]) was used to, and initial C. *perfringens* contamination levels were estimated to be  $-2.9 \log CFU/ml$  (Figure 1).

## 3.2 | Predictive model to describe the kinetic behavior of *C. perfringens*

To describe the C. perfringens cell count changes in soy sauce during transportation, storage, and display, the predictive models were developed. C. perfringens cell counts were collected at 7, 15, 25, and 35°C. The data were then fitted with the Weibull model to calculate  $\delta$  and  $\rho$  values.  $R^2$  values were 0.824–0.935, indicating that the developed model was appropriate to predict the cell counts as storage time increase from 7-35°C. The developed primary model showed that  $\delta$  (the time needed to decrease 1 log CFU/ ml) decreased as temperature increased (Figure 2, Table 1). This means that the increase in the storage temperature, the shorter the time it takes for 1 log CFU/ml reduction of C. perfringens cell counts in the soy sauce. Also, the  $\rho$  values ranged from 0.18 to 0.89 (Table 1). To evaluate the effect of temperature on  $\delta$  and  $\rho$ values, a secondary model was developed, using the exponential growth model. The models were  $\delta = 1/(-0.0057) + (0.0043 \times exp$  $[0.1319 \times T]$  and  $\rho = 1/(1.0196) + (0.0539 \times \exp[0.1274 \times T])$  with 0.942 and 0.985 of  $R^2$ , respectively, indicating that the secondary models were developed appropriately to describe the changes of the parameters as a function of temperature. Validation of model performance showed that RMSE values were 0.403 and 0.854 at 20 and 30°C, respectively. B<sub>e</sub> and A<sub>e</sub> were 1.07 and 1.19 at 20°C, and 1.40 and 1.40 at 30°C. This indicates that the developed



**FIGURE 3** Probabilistic distribution for the intake of soy sauce in Korea

2143

-WILEY

 TABLE 2
 Simulation model for calculating the risk of Clostridium perfringens through soy sauce intake with @RISK

Input model	Unit	Variable	Formula	References
Product				
Pathogens contamination level				
C. perfringens prevalence		PR	=RiskBeta (1,491)	This research; Vose (1997)
Initial contamination level	CFU/ml	С	=-LN (1 - PR)/1 ml	Sanaa et al. (2004)
Market	log CFU/mi	IC.	=logC	
Transportation				
Transportation	h.	Time	DiskDort (0 5 2 5)	Dereenel
Transportation time	III	Time <sub>trans</sub>	=KISKFELL (0.3, 3, 3)	communication <sup>a</sup> ; This research
Food temperature during transportation	°C	Temp <sub>trans</sub>	=RiskWeibull (1.3219, 2.8404, RiskShift [3.1093], RiskTruncate [2.2, 40])	Personal communication; This research
Death				
Delta	hr	δ	$=1/([-0.0057] + 0.0043 \times exp$ [0.1319 × Temp <sub>trans</sub> ])	This research
ρ		ρ	=1/(1.0196 + 0.0539 × exp (0.1274 × Temp <sub>trans</sub> ))	This research
C. perfringens survival model	log CFU/ml	C1	=IC-(Time <sub>trans</sub> / $\delta$ ) $^{\rho}$	Mafart et al. (2002)
Storage				
Storage time	hr	Time <sub>Mark-st</sub>	=RiskUniform (0.1, 48)	Personal communication; This research
Food temperature during storage	°C	Temp <sub>Mark-st</sub>	=RiskPert (22, 25, 26)	Personal communication; This research
Death				
Delta	hr	δ	=1/([-0.0057] + 0.0043 × exp [0.1319 × Temp <sub>Mark-st</sub> ])	This research
ρ		ρ	=1/(1.0196 + 0.0539 × exp [0.1274 × Temp <sub>Mark-st</sub> ])	This research
C. perfringens survival model	vival model log CFU/ml		=C1-(Time <sub>Mark-st</sub> / $\delta$ ) <sup><math>\rho</math></sup>	Mafart et al. (2002)
Display				
Display time	hr	Time <sub>Mark-dis</sub>	=RiskUniform (0, 336)	Personal communication; This research
Food temperature during display	°C	Temp <sub>Mark-dis</sub>	=RiskLogLogistic (16.608, 5.6198, 14.584, RiskTruncate [2.2, 40])	Personal communication; This research
Death				
Delta	hr	δ	=1/([-0.0057] + 0.0043 × exp [0.1319 × Temp <sub>Mark-dis</sub> ])	This research
ρ		ρ	=1/(1.0196 + 0.0539 × exp [0.1274 × Temp <sub>Mark-dis</sub> ])	This research
C. perfringens survival model	log CFU/ml	C3	= C2-(Time <sub>Mark-dis</sub> / $\delta$ ) <sup><math>\rho</math></sup>	Mafart et al. (2002)
Consumption				
Daily consumption average amount	ml	Consump	=RiskExpon (7.8108, RiskShift (-0.0014513), RiskTruncate [0, 215])	KCDC. (2017)
Daily consumption percentage	%	ConFre	Fixed 81.2	KCDC. (2017)
		CF(0)	=1-81.2/100	KCDC. (2017)
		CF(1)	=81.2/100	KCDC. (2017)
		CF	=RiskDiscrete ({0, 1},{CF(0), CF(1)})	KCDC. (2017)
		Amount	=IF (CF = 0, 0, Consump)	KCDC. (2017)

(Continues)

2144

#### TABLE 2 (Continued)

Input model	Unit	Variable	Formula	References
Dose-response				
C. perfringens amonut	CFU	Ν	$=10^{C3} \times Amount$	Golden et al. (2009)
Parameter of r		r	=Fixed $1.82 \times 10^{-11}$	
Risk				
Probability of illness/person/da	у	Risk	$=1-\exp(-r \times N)$	Golden et al. (2009)



FIGURE 4 Changes in Clostridium perfringens contamination levels in soy sauce predicted by distributions during transportation

	5%	25%	50%	95%	99%	Mean
Probability of illness/ person/day	0	0	0	0	$3.9 \times 10^{-15}$	$1.7 \times 10^{-16}$

TABLE 3 Probability of Clostridium perfringens foodborne illness per person per day with consumption of soy sauce

predictive models were appropriate to predict the C. perfringens cell counts in soy sauce during transportation and storage.

3.3 | Time and temperature for transportation,

storage, and display

To predict changes in C. perfringens cell counts with the predictive model, during transportation, storage, and display time and temperature data are necessary. Hence, time and temperature for transportation and storage of soy sauce were collected. The probabilistic distribution for the temperature of the transport vehicle was appropriate with the Weibull distribution (RiskWeibull [1.3219, 2.8404, RiskShift (3.1093), RiskTruncate (2.2, 40)]) and with the Pert distribution with parameters (0.5, 3, 5) for the transport time. The probabilistic distribution showed that the mean temperature of the soy sauce was 5.7°C during transportation from production to sale. The products were then stored at 22-26°C for 0.1-48 hr. Thus, the temperatures were fitted to the Pert distribution (RiskPert [22, 25, 26]), and the storage time was fitted to the uniform distribution (RiskUniform [0.1, 48]). The probabilistic distribution for the display temperature was appropriate with loglogistic distribution (RiskLogLogistic [16.608, 5.6198, 14.584, RiskTruncate (2.2, 40)]), and the display time was fitted to the uniform distribution with parameters (0, 336).

#### 3.4 | Amounts and percentage of soy sauce consumption

Raw data for daily consumption amounts of soy sauce extracted from KNHANES (Korea Centers for Disease Control & Prevention, 2017) were fitted with @RISK. Exponential distribution (RiskExpon [7.8108, RiskShift [-0.0014513], RiskTruncate (0, 215)]) was selected to be the appropriate probabilistic distribution for the consumption of soy sauce, and the probabilistic distribution showed that the average daily consumption of soy sauce was 7.81 ml (Figure 3) with 81.2% of consumption percentage in Korea.

#### 3.5 | Dose-response model

For the dose-response model for C. perfringens, there was only one model, which was the exponential model [ $p = 1 - \exp(-r \times N)$ ,  $r = 1.82 \times 10^{-11}$  developed by Golden et al. (2009), where P is the





**FIGURE 5** Correlation coefficients for risk factors affecting the probability of *Clostridium perfringens* illness per person per day by soy sauce consumption

probability of illness, *r* is the probability of *C. perfringens* cells, causing foodborne illness, and *N* is the *C. perfringens* cell number (CFU/ serving) ingested. Hence, this model was used in a simulation model.

#### 3.6 | Risk characterization

Employing estimated C. perfringens contamination level, predictive models simulating C. perfringens cell counts with the probabilistic distributions of temperature and time, probabilistic distribution of consumption amounts, consumption percentage, and dose response model, the simulation model was prepared as shown in Table 2. The cumulative density determined by this simulation showed that estimated C. perfringens cell counts decreased gradually from initial contamination (IC) to display (C3) (Figure 4). The simulation result showed that the risk of C. perfringens per person per day through soy sauce consumption was  $1.7 \times 10^{-16}$  in Korea (Table 3). Also, the risk has a positive correlation with prevalence, consumption amount, and consumption percentage. On the other hand, it shows a negative correlation with market display time and market storage time. (Figure 5). In a study by Ko et al. (2012), the probabilities of C. perfringens foodborne illness per person per day for ham and sausage products was estimated as  $3.97 \times 10^{-11} \pm 1.80 \times 10^{-9}$ . Also, the probability of C. perfringens foodborne illness by cheese consumption for natural and processed cheeses was  $9.57 \times 10^{-14}$  and  $3.58 \times 10^{-14}$  per person per day, respectively (Lee et al., 2016). Comparing these risks with the risk estimated in our study the risk of C. perfringens foodborne illness from soy sauce consumption was relatively low. This result might be caused by high salt concentration of soy sauce, which decrease C. perfringens cell counts are suggested in many studies (Chhetri & Karki, 2014; Gibson & Roberts, 1986; Juneja & Marmer, 1996).

#### 4 | CONCLUSIONS

In conclusion, the risk for *C. perfringens* foodborne illness soy sauce consumption in Korea is low, because although soy sauce is

consumed widely, *C. perfringens* prevalence in soy sauce is low, and *C. perfringens* cell counts decreased during transportation, storage, and display.

#### ACKNOWLEDGMENTS

This research was supported by a grant (17162KFDA035) from the Ministry of Food and Drug Safety in 2017.

#### CONFLICT OF INTEREST

The authors declare that they have no conflict of interest.

#### ORCID

Yeongeun Seo D https://orcid.org/0000-0003-4986-9770 Yewon Lee D https://orcid.org/0000-0001-8715-1140 Sejeong Kim D https://orcid.org/0000-0001-9741-8056 Jimyeong Ha D https://orcid.org/0000-0001-7973-7926 Yukyung Choi D https://orcid.org/0000-0002-7994-9862 Hyemin Oh D https://orcid.org/0000-0002-8073-7242 Yujin Kim D https://orcid.org/0000-0002-0903-9871 Min Suk Rhee D https://orcid.org/0000-0003-0412-1910 Yohan Yoon D https://orcid.org/0000-0002-4561-6218

#### REFERENCES

- Centers for Disease Control and Prevention. (2017). Surveillance for foodborne disease outbreaks united states, 2017: Annual Report. Retrieved from https://www.cdc.gov/fdoss/pdf/2017\_FoodBorneOutbre aks\_508.pdf?deliveryName=DM9453
- Chhetri, V. S., & Karki, T. B. (2014). Occurrence of Clostridium perfringens in raw meat, poultry and meat spices and effect of sodium chloride and reduced pH on the outgrowth of their spores. *Asian Journal of Microbiology Biotechnology & Environmental Sciences*, 16(4), 885–889.
- Codex Alimentarius Commission. (2015). *Procedural manual*, 24th edition. Retrieved from http://www.fao.org/3/a-i5079e.pdf
- Gibson, A. M., & Roberts, T. A. (1986). The effect of pH, sodium chloride, sodium nitrite and storage temperature on the growth of Clostridium perfringens and faecal streptococci in laboratory media. *International Journal of Food Microbiology*, 3(4), 195–210. https://doi. org/10.1016/0168-1605(86)90023-1.
- Golden, N. J., Crouch, E. A., Latimer, H., Kadry, A. R., & Kause, J. (2009). Risk assessment for Clostridium perfringens in ready-to-eat and partially cooked meat and poultry products. *Journal of Food Protection*, 72(7), 1376–1384. https://doi.org/10.4315/0362-028X-72.7.1376.
- Ha, J., Lee, J., Lee, S., Kim, S., Choi, Y., Oh, H., Kim, Y., Lee, Y., Seo, Y., & Yoon, Y. (2019). Mathematical models to describe the kinetic behavior of Staphylococcus aureus in jerky. *Food Science of Animal Resources*, 39(3), 371.
- Jeong, J., Chon, J. W., Kim, H., Song, K. Y., & Seo, K. H. (2018). Risk assessment for salmonellosis in chicken in South Korea: The effect of Salmonella concentration in chicken at retail. *Korean Journal for Food Science of Animal Resources*, 38(5), 1043.
- Juneja, V. K., & Marmer, B. S. (1996). Growth of Clostridium perfringens from spore inocula in sous-vide turkey products. *International Journal of Food Microbiology*, 32(1–2), 115–123. https://doi. org/10.1016/0168-1605(96)01111-7.
- Ko, E. K., Moon, J. S., Wee, S. H., & Bahk, G. J. (2012). Quantitative microbial risk assessment of clostridium perfringens on ham and sausage products in Korea. Korean Journal for Food Science of Animal Resources, 32(1), 118–124. https://doi.org/10.5851/kosfa.2012.32.1.118.
- Korea Agro-Fisheries & Food Trade Corporation. (2018). Segment market of processed food current state: Soy sauce market. Retrieved from http://www.atfis.or.kr/article/M001050000/view.do?artic

leld=3024&page=2&searchKey=&searchString=&searchCate
gory=

- Korea Centers for Disease Control and Prevention. (2017). Korea health statistics. Retrieved from https://knhanes.cdc.go.kr/knhanes/sub03/ sub03\_02\_02.do
- Lee, H., Lee, S., Kim, S., Lee, J., Ha, J., & Yoon, Y. (2016). Quantitative microbial risk assessment for clostridium perfringens in natural and processed cheeses. Asian-Australasian Journal of Animal Sciences, 29(8), 1188–1196.
- Lee, J., Lee, H., Lee, S., Kim, S., Ha, J., Choi, Y., & Seo, K. (2019). Quantitative microbial risk assessment for *Campylobacter jejuni* in ground meat products in Korea. *Food Science of Animal Resources*, 39(4), 565.
- Mafart, P., Couvert, O., Gaillard, S., & Leguérinel, I. (2002). On calculating sterility in thermal preservation methods: Application of the Weibull frequency distribution model. *International Journal of Food Microbiology*, 72(1–2), 107–113. https://doi.org/10.1016/S0168-1605(01)00624-9.
- McClane, B. A., Robertson, S. L., & Li, J. (2012). Clostridium perfringens. Food microbiology: Fundamentals and frontiers, 465–489.
- Ministry of Food and Drug Safety. (2018). Food and drug statistical yearbook. Report No.: 11-1471000-000165-10. Retrieved from https:// www.mfds.go.kr/brd/m\_371/view.do?seq=30714&srchFr=&srchT o=&srchWord=&srchTp=&itm\_seq\_1=0&itm\_seq\_2=0&multi\_itm\_ seq=0&company\_cd=&company\_nm=&page=1
- Ministry of Food and Drug Safety. (2020). Foodborne disease statistics. Retrieved from https://www.foodsafety

korea.go.kr/portal/healthyfoodlife/foodPoisoningSt at.do?menu\_no=3724&menu\_grp=MENU\_NEW02

- Sanaa, M., Coroller, L., & Cerf, O. (2004). Risk assessment of listeriosis linked to the consumption of two soft cheeses made from raw milk: Camembert of Normandy and Brie of Meaux. *Risk Analysis: An International Journal*, 24(2), 389–399. https://doi. org/10.1111/j.0272-4332.2004.00440.x.
- Vose, D. J. (1998). The application of quantitative risk assessment to microbial food safety. *Journal of Food Protection*, 61(5), 640–648. https://doi.org/10.4315/0362-028X-61.5.640.
- WHO. (2002). Risk assessments of Salmonella in eggs and broiler chickens. Retrieved from http://www.fao.org/3/a-y4392e.pdf
- Yoon, Y., Park, J. N., Sohn, H. S., Song, B. S., Kim, J. H., Byun, M. W., & Lee, J. W. (2011). Modeling the effect of γ-irradiation on reducing total bacterial populations in gochujang intended for consumption by astronauts in space programs. *Food Science and Biotechnology*, 20(2), 377–382. https://doi.org/10.1007/s10068-011-0053-2.

How to cite this article: Seo Y, Lee Y, Kim S, et al. Contamination of *Clostridium perfringens* in soy sauce, and quantitative microbial risk assessment for *C. perfringens* through soy sauce consumption. *Food Sci Nutr.* 2021;9:2139– 2146. https://doi.org/10.1002/fsn3.2182