

Source attribution of Foodborne Diseases using Structured Expert Judgement (SEJ)

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WHO Webinar: Source attribution method in the foodborne diseases estimates



Global source attribution study team*

- Tina Nane (TU Delft)
- Tine Hald (DTU)
- Roger Cooke (Resources for the Future, TU Delft)
- Willy Aspinall (Aspinall&Associates)



- Research assistants from TU Delft
 - Bodille Blomaard, Alessandra Primavera
 - Femke Schurmann, Tyren Koning
 - Floor Jacobs, Vangelis Nakos
 - Si-Jing Chen, Judith Capel

WHO selected our team after the competitive bidding process. https://cdn.who.int/media/docs/default-source/foodborne-diseases/ferg/ferg-satf-001-tor.pdf?sfvrsn=3ade1f0f_3

Expert judgment methods



Combination of experts' assessments

- Behavioral aggregation techniques
 - Sheffield
- Mathematical aggregation techniques
 - Bayesian methods
 - Equal weighting aggregation
 - Un-equal weighting aggregation (Classical Model)
- Mixed techniques
 - Delphi
 - IDEA

The Classical Model for Structured Expert Judgment



- **Experts in Uncertainty (Cooke, 1991)**
 - Cooke Method
 - Delft Method
 - The Classical Model for Structured Expert Judgment
- Numerous applications
 - Climate change
 - Nuclear applications
 - Chemical & gas industry
 - Ground water, water pollution, dikes, barriers
 - Epidemiology
 - Natural disasters and extreme events
 - Aerospace sector, space debris, aviation
 - Volcanoes, dams



Classical Model for Structured Expert Judgment

Overconfidence

Target questions: attribution estimates

- Hazards:
- 25 enterics
 - 10 parasites
 - 6 chemicals
 - 7 transmission pathways
 - 14 specific food categories
 - 17 cluster of countries (sub-regions)

Model:

- Multiple experts
- Mathematical combination of experts' assessments
- Uncertainty quantification

Calibration questions:

- tailored to hazard/regional expertise

Weights for mathematical aggregation of the target questions assessments

Cooke's Classical Model

❑ Considerations for the choice of method

- Expert data is scientific data (empirical control)
- Validated aggregation to calibrate the mathematical model
- Transparent, reproducible and defensible

❑ Practical considerations

- Gathering experts not possible
- Face-to-face interviews not possible
- Multidisciplinary panel
- Interviews conducted in different languages

Calibrate



Validate

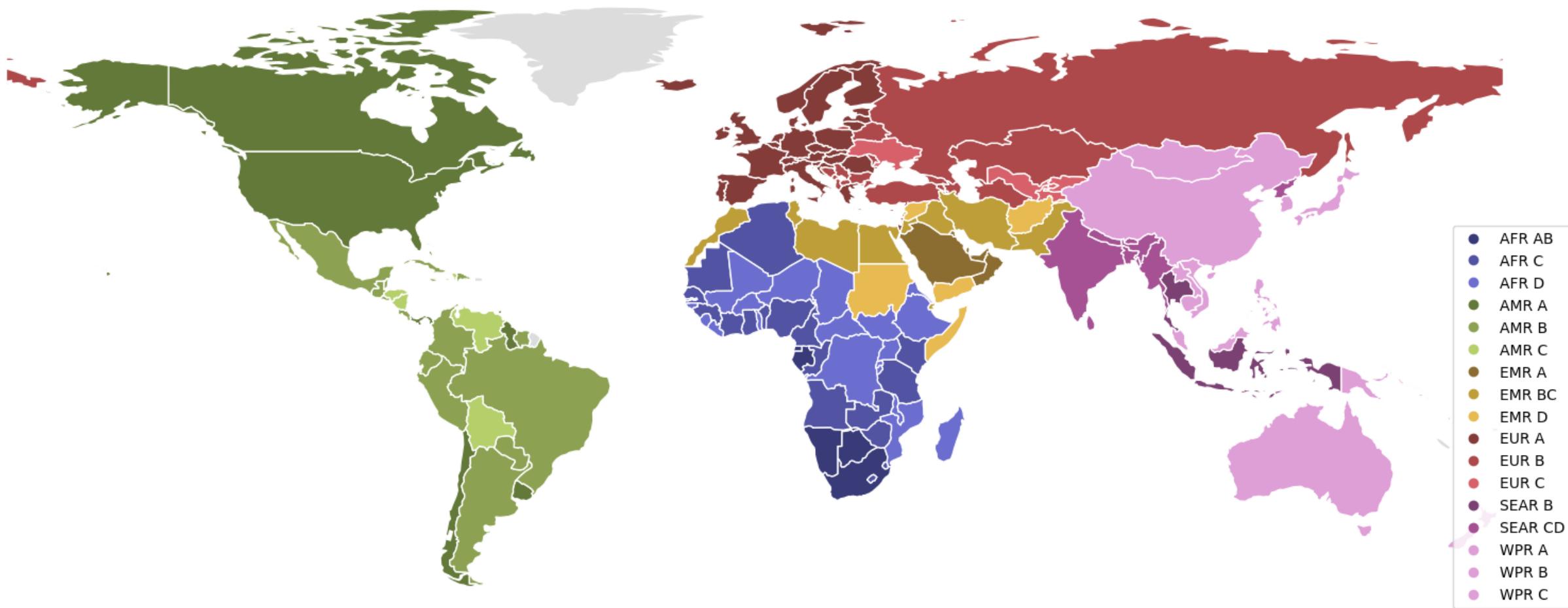


Verify

Hazards

| Enteric diseases (diarrheal diseases) 14 | Enteric diseases (non-diarrheal diseases) - 10 | Parasitic diseases 10 | Chemicals and Toxins 6 |
|--|--|---|---------------------------|
| <i>Campylobacter</i> spp. | <i>Brucella</i> spp. | <i>Ascaris lumbricoides</i> | Aflatoxin B1 |
| <i>Cryptosporidium</i> spp. | <i>Clostridium perfringens</i> | <i>Echinococcus multilocularis</i> | Arsenic |
| <i>Cyclospora</i> (new) | <i>Clostridium botulinum</i> | <i>Echinococcus granulosus</i> | Cadmium |
| <i>Entamoeba histolytica</i> | Hepatitis A virus | <i>Fasciola</i> spp.& <i>Fasciolopsis</i> | Dioxin |
| Enteroaggregative <i>E.coli</i> | Hepatitis E virus | <i>Toxoplasma</i> | Lead |
| Enteropathogenic <i>E.coli</i> | <i>Listeria monocytogenes</i> | <i>Trichinella</i> | Methylmercury |
| Enterotoxigenic <i>E.coli</i> | <i>Mycobacterium bovis/caprae/orygis</i> | <i>Trypanosoma cruzi</i> | |
| <i>Giardia</i> spp. | <i>Salmonella</i> Paratyphi A | <i>Toxocara</i> | |
| Norovirus | <i>Salmonella</i> Typhi | <i>Angiostrongylus</i> | |
| Rotavirus | Bacterial toxins: <i>Staph. aureus</i> | <i>Sarcocystis</i> | |
| Non-typhoidal <i>Salmonella enterica</i> | | | |
| <i>Shigella</i> spp. | | | |
| Shiga toxin-producing <i>E.coli</i> | | | |
| <i>Vibrio cholerae</i> | | | |

17 cluster of countries



Target questions

- For each biological hazard (n=35) and cluster of countries (n=17), estimate the proportion of disease that is transmitted through different pathways



Lower uncertain
(5th percentile)

Best estimate
(50th percentile)

Upper uncertain
(95th percentile)

Target questions

- ❑ Estimate the proportion of disease that is transmitted through *water* for Non-typhoidal Salmonella enterica in AFR AB

**Lower uncertain bound
(5th percentile)**

**Best estimate
(50th percentile)**

**Upper uncertain bound
(95th percentile)**

Calibration questions

Example questions
are from previous
study (2015)

Categories of calibration questions for enteric and parasitic hazards

- **Food supply**

- E.g. Among all sub-regions, in 2010 what was the proportion of regional vegetable supply (tonnes) that was imported rather than produced domestically in the sub-region with the highest such percentage?

- **Health and diarrheal diseases**

- **Improved water and sanitation**

- **Outbreak and disease surveillance**

- E.g. What will be the rate per 100,000 population of laboratory confirmed human cases of campylobacteriosis in 2012 in all EU member states as reported in EFSA's annual report?

Lower uncertain
(5th percentile)

Best estimate
(50th percentile)

Upper uncertain
(95th percentile)

Elicitation process

1. Expert selection

- WHO Open call
- Networking (WHO, FERG, snowball effect)

2. Pre-elicitation

- Hazard/regional expertise (Qualtrics link)
- Training module (Qualtrics link)
 - Consent form

3. Elicitation

- Elicitation interview (one-to-one online meeting with a trained elicitor)
 - Cover the calibration questions (tailored to hazard/regional expertise)
 - Go through one hazard

4. Post-elicitation

- Complete all the assessments for all hazards/cluster of countries (2 weeks)
- Fill in a very short feedback survey

Expert identification and selection

2. Expert selection

• Expert selection



- Screening done by WHO Collaborative Centre (**263 recruited experts**)
 - Larger areas of expertise – pathogens, parasites, chemicals
 - Self-reported by experts
 - Check if the information provided in the CV matched the self-reported expertise

□ Networking (**108 experts**)

□ Additional survey (Qualtrics)

- Hazard/regional expertise
- Qualitative expertise level

| | Expertise | | | | | Regions | | | | | | | | | | | | | | | | | |
|-------------------------------|-----------|---|---|---|---|-------------|--------|-------|-------|-------|-------|-------|-------|--------|-------|-------|-------|-------|---------|---------|-------|-------|-------|
| | 1 | 2 | 3 | 4 | 5 | All regions | AFR AB | AFR C | AFR D | AMR A | AMR B | AMR C | EMR A | EMR BC | EMR D | EUR A | EUR B | EUR C | SEAR BC | SEAR CD | WPR A | WPR B | WPR C |
| Angiostrongylus cantonensis | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Angiostrongylus costaricensis | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Ascaris lumbricoides | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Bacillus cereus | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Brucella sp. | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Campylobacter sp. | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Clostridium botulinum | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Clostridium perfringens | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Cryptosporidium sp. | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Cyclospora sp. | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Echinococcus granulosus | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Echinococcus multilocularis | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Entamoeba histolytica | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Enterogregarive E. coli | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Enteropathogenic E. coli | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Enterotoxigenic E. coli | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Fasciola & Fasciolopsis | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |
| Giardia sp. | ○ | ○ | ○ | ○ | ○ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ | □ |

1 = low (e.g., no direct experience, anecdotal knowledge only)

3 = medium (e.g., some direct experience, but wide reading)

5 = high (e.g., primary focus of my professional work)

Training materials

6.Training materials

- Videos
- Training questions
- Practice exercises



☐ Videos

- Introduction to the study
- Introduction to SEJ
- Uncertainty quantification
 - Practice questions
- Practical matters about the elicitation
- Features of the Qualtrics elicitation tool

☐ Training questions

☐ Practice exercises

Elicitation tool

- ☐ Developed in Qualtrics
 - Online tool
 - GDPR compliant
- ☐ Tailored for regional expertise

5. Elicitation tool

- Online (Qualtrics)
- Developing and testing
- Translating



For each of the following hazards, and in combination with regions, please indicate your expertise.

The list of countries in all regions is provided below.

| | Region | | | | | | | | | | | | | | | |
|--------------------------|--------------------------|--------------------------|--------------------------|-------------------------------------|-------------------------------------|-------------------------------------|--------------------------|--------------------------|--------------------------|-------------------------------------|--------------------------|--------------------------|--------------------------|--------------------------|--------------------------|--------------------------|
| | AFR AB | AFR C | AFR D | AMR A | AMR B | AMR C | EMR A | EMR BC | EMR D | EUR A | EUR B | EUR C | SEAR B | SEAR CD | WPR A | WPR B |
| Staphylococcus aureus | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Clostridium perfringens | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Brucella sp. | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Campylobacter sp. | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input checked="" type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Clostridium botulinum | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Cryptosporidium sp. | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Cyclospora sp. | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Enteropathogenic E. coli | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Enterotoxigenic E. coli | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Enteraggregative E. coli | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Giardia sp. | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Hepatitis A | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Hepatitis E | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Listeria monocytogenes | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input checked="" type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Norovirus | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Rotavirus | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Salmonella Typhoid | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |
| Salmonella Paratyphoid | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |

Please provide uncertainty assessments for **Non-typhoidal Salmonella enterica**, in $\{ln, field/1\}$. Express your assessments as **percentages of all human cases** and first focus on major transmission pathways.

*Think of the source that was the direct cause of human exposure. We are not asking about how the source was contaminated. For more information about the definition used in this study, please check this [file](#).

| | Lower credible value (5th percentile) | Central value (50th percentile) | Upper credible value (95th percentile) |
|---|---------------------------------------|---------------------------------|--|
| Food | <input type="text"/> | <input type="text"/> | <input type="text"/> |
| Contact with Animals (Domestic or Wild) | <input type="text"/> | <input type="text"/> | <input type="text"/> |
| Human contact | <input type="text"/> | <input type="text"/> | <input type="text"/> |
| Water | <input type="text"/> | <input type="text"/> | <input type="text"/> |
| Soil | <input type="text"/> | <input type="text"/> | <input type="text"/> |
| Other (e.g. airborne/pollution, occupational) | <input type="text"/> | <input type="text"/> | <input type="text"/> |

Great support from elicitors

3. Elicitor selection

• Elicitor selection



- Eduard Grau Noguer
- Zoe Baldwin
- Emrecaan Özeler
- Emi Grace
- Stephanie Poling
- Ana Margarida Alho
- Uswatun Hasanah
- Selam Alemu
- Jamila Seaton
- Devin LaPolt
- Sarah Hagan
- Maria Olorunsola
- Janet Rymound

- Sara Faife
- Eiki Yamasaki
- Stanley Chen
- Ankur Aggarwal
- Pankaj Dhaka
- Lisa O'Connor
- Maria Francesca Julietto
- Miranda Nonikashvili
- Reha Onur Azizoglu
- Dikshit Poudel
- Nada Alasiri
- Belisário Moiane
- Dhanalakshmi Marimuthu
- Malak Elbassuny

Source attribution of foodborne diseases using SEJ

Thank you for your time and attention!

Subregional classification

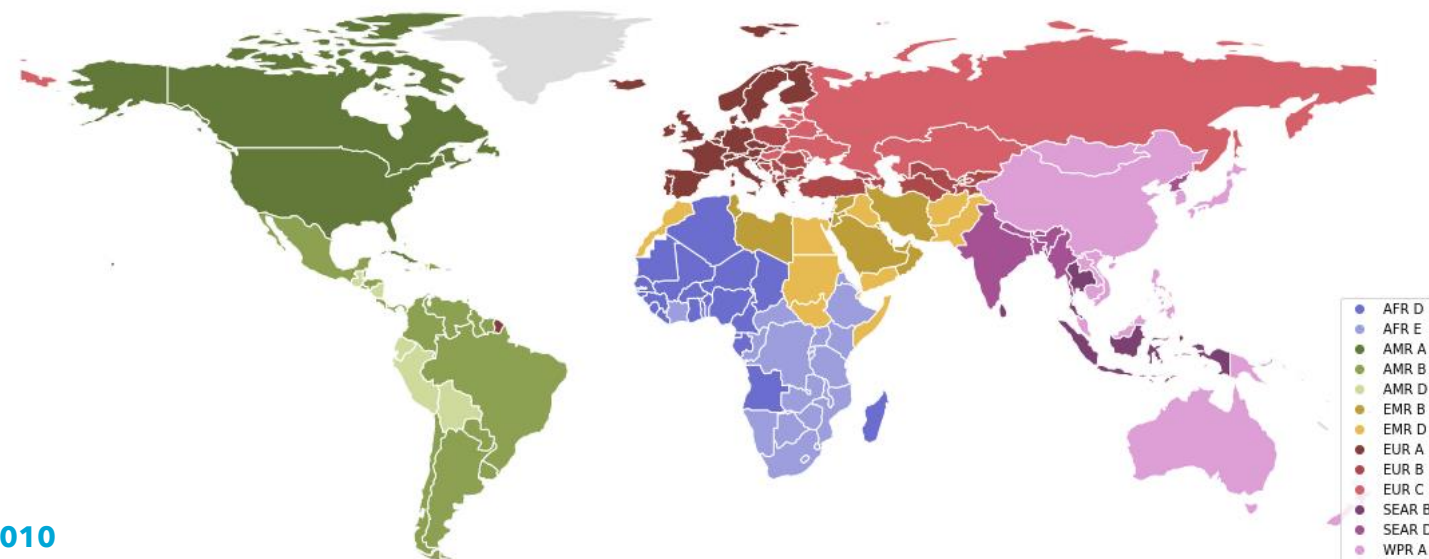
Old & new classification

Regions 2010

| | AFR | | AMR | | EMR | | EUR | | | SEAR | | WPR | |
|---------|-----|-----|-----|-----|-----|------|-----|-----|-----|------|------|-----|------|
| | D | E | A | B | D | B | A | B | C | B | D | A | B |
| AFR AB | 5% | 95% | | | | | | | | | | | |
| AFR C | 68% | 32% | | | | | | | | | | | |
| AFR D | 28% | 69% | | | | | 3% | | | | | | |
| AMR A | | | 93% | 7% | | | | | | | | | |
| AMR B | | | 2% | 86% | 12% | | | | | | | | |
| AMR C | | | | 59% | 41% | | | | | | | | |
| EMR A | | | | | | 100% | | | | | | | |
| EMR BC | | | | | | 23% | 77% | | | | | | |
| EMR D | | | | | | 18% | 82% | | | | | | |
| EUR A | | | | | | | 84% | 12% | 3% | | | | |
| EUR B | | | | | | | | 41% | 59% | | | | |
| EUR C | | | | | | | | 48% | 52% | | | | |
| SEAR B | | | | | | | | | | 100% | | | |
| SEAR CD | | | | | | | | | | | 100% | | |
| WPR A | | | | | | | | | | | | 76% | 24% |
| WPR B | | | | | | | | | | | | | 100% |
| WPR C | | | | | | | | | | | | | 100% |

Percentage of old regions represented by the new regions (read horizontally)
based on population sizes in 2010 (Worldbank)

2010



2019

