DATA ANALYTICAL APPROACH FOR THE IDENTIFICATION OF EMERGING FOOD SAFETY RISKS

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INTRODUCTION EMERGING RISK DEFINITION

or increased significant exposure and/or susceptibility to a known hazard' (EFSA)



- severity of risks
- Continuous evaluation of risks and continuous knowledge genaration \rightarrow complex process

'An emerging risk to human, animal and/or plant health is understood as a risk resulting from a newly identified hazard to which a significant exposure may occur or from an unexpected new

RISK BASED APPROACH: Timely identification of food systems risks needs a profound knowledge on the prevalence and



HORIZON SCANNING UNIVERSE

DEFINITIONS IN THE HORIZON SCANNING UNIVERSE



SHORT TERM

Rapid alert systems

Immediate action required

Ongoing outbreaks/incidents

somewhere else











MEDIUM TERM

Screening systems

Increases preparedness

Initiates risk assessment

FORESIGHT

LONG TERM

Driver and scenario analysis

Affects strategic actions



EMERGING ISSUES: EXAMPLE

PRACTICAL EXAMPLES





CHALLENGES

- Finding the "next food systems issue"
- Systematic analysis of short, medium and long timescale data and information
- Challenges: data/information gaps, different timescales etc.



Source: De Spiegeleire, Stephan & Bekkers, Frank. (2012). Who says generals can't dance: Strategic agility and defence capability options.



















SYSTEMATIC APPROACH



COLLECTION AND COLLATION OF DATA & INFORMATION



Screening various data & information sources

- media and scientific literature
- data from food safety authorities
- patent databases
- Collecting expert knowledge

- Characteristics assessed:
 - novelty, significance, susceptibility
- Prioritization: evaluation based on predefined criteria
 - soundness, imminence, scale, severity
 - risk management situation



- Multidisciplinary team with high level expertise

ANALYSIS AND FILTERING



- Risk management/preparedness:
 - new procedures, modifying HACCP plans, etc.
- Communication with various target audience:
 - consumers, business, authorities
- Research

Automated data retrieval, Text mining, Data mining, Network analysis, AI&ML, Visualization



DATA/INFORMATION SOURCES

DATA/INFORMATION SOURCES FOR EMERGING ISSUE IDENTIFICATION

Rapid alert systems (mainly RASFF, INFOSAN)

News (with global coverage)

Patent databases (WIPO, EPO, USPTO) Scientific publication databases (PubMed, Science Direct, Web of Science, CAB Abstract, FSTA Abstracts)

Social media news aggregating services

Sample and control data from European food safety authorities

Collecting expert knowledge



DATA ANALYTICAL METHODS FOR EMERGING RISK IDENTIFICATION

TOPIC DETECTION

IDENTIFYING TRENDING TOPICS IN NEWS BASED ON TEXT MINING AND NETWORK ANALYSIS

- EMM European Media Monitor – food safety news from one week is retrieved from RSS feed
- The co-occurrence network of words is arranged into topics
- Network and topics are analysed further manually by experts, who select news which contain information on possible emerging issues/risk





DATA ANALYSIS IDENTIFYING TRENDING TOPICS IN NEWS DYNAMIC TOPIC MODELLING **Intertopic Distance Map** Topic 3 cough | uzbekistan | syrups | syrup | marion **BERTopic** framework: most advanced default algorithms Size: 66 Dynamic topic modelling is possible Challenges: Best algorithm parameters – we don't know D1 \bigcirc beforehand – iterative process for fine-tuning as different datasets require different parameters to get the most meaningful results \bigcirc → Best timescales **Topics over Time** Best input data in terms of text content 30-Global Topic Represen 1 sleepers fisherprice 25 food hygiene poiso 4 protocol ni starmer Topic 5 —— 5_cough_uzbekistan_s⁻ Words: cough, syrups, uzbekistan, indian, marion ----- 6_salmonella_fulltext_fr 15 Freque 10 Apr 2020 Jul 2020 Oct 2020 Jan 2021 Apr 2021 Jul 2021 Oct 2021 Jan 2022 Apr 2022



DATA ANALYTICAL METHODS FOR EMERGING RISK IDENTIFICATION

WEAK SIGNAL MINING

DATA MINING UNIVERSE

DEFINITIONS IN DATA MINING: WEAK SIGNALS, STRONG SIGNALS, TRENDS



WEAK SIGNALS

- Low visibility
- Low number of events
- Low interpretation
- IN DATA MINING: LOW TERM AND DOCUMENT FREQUENCY BUT HIGH GROWTH-RATE

Early signal

STRONG SIGNALS

- High visibility
- High number of events
- High interpretation
- IN DATA MINING: HIGH TERM AND DOCUMENT FREQUENCY AND HIGH GROWTH-RATE

TRENDS/DRIVERS

- Phenomena that are already known to many people
- Already manifested



FUTURE RESEARCH DIRECTIONS WEAK SIGNAL MINING

Park et al., 2017

- Takes into account the timely dinamics
- Applicable for keyword detection

DATA ANALYTICAL METHODS FOR EMERGING RISK IDENTIFICATION

COMBINED METHODS

FUTURE RESEARCH DIRECTIONS **COMBINING METHODS: WEAK SIGNAL MINING AND TOPIC DETECTION**

- workaround)
- signals
- Many research directions, e.g.:
 - Dynamic topic modelling (dynamic BERTopic)
 - Identifying keywords with weak signal mining to enhance topic modelling
 - Word embedding methods combined with topic modelling

Limitation of topic modelling: it has no time dimension, static picture (repeated weakly in our

Limitation of weak signal mining: no topics and exact definitions for the scale of weak to strong

Liu, L., et al. An overview of topic modeling and its current applications in bioinformatics. SpringerPlus 5, 1608 (2016).

SUMMARY

KEY MESSAGES

- Data analytical methods are effective in helping ERI and early signal identifying processes, they help in identifying important issues from an extremely noisy environment.
- But expert knowledge is still important: data validation, choosing the right analytical framework, interpretation of the results, etc.
- **UTILIZATION:** input for monitoring program planning, initiating risk assessments, communication activities
- The process management system and the possible data analytical methods for emering risk identification (but not early signal detection) is published in Farkas et al. 2023. *Emerging risk identification in the food chain – A systematic procedure and data* analytical options. Innovative Food Science & Emerging Technologies. <u>https://doi.org/10.1016/j.ifset.2023.103366</u>

Innovative Food Science & Emerging Technologies LSEVIER Available online 23 April 2023, 103366 In Press, Journal Pre-proof (?) What's this? 🗖 Emerging risk identification in the food chain – A systematic procedure and data analytical options Zsuzsa Farkas ^{a b}, Erika Országh ^{a b} \gtrsim \boxtimes , Tekla Engelhardt ^{a b}, Andrea Zentai ^{a b}, Miklós Süth^{a b}, Szilveszter Csorba^{a b}, Ákos Jóźwiak^{a b} Show more \checkmark + Add to Mendeley 😪 Share 📑 Cite https://doi.org/10.1016/j.ifset.2023.103366 >>

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