

# 

**Citation:** Huybrechts I, Jacobs I, Biessy C, Aglago EK, Jenab M, Claeys L, et al. (2024) Associations between dietary mycotoxins exposures and risk of hepatocellular carcinoma in a European cohort. PLoS ONE 19(12): e0315561. https://doi.org/ 10.1371/journal.pone.0315561

Editor: Samuel Adelani Babarinde, Ladoke Akintola University of Technology, NIGERIA

Received: August 12, 2024

Accepted: November 27, 2024

Published: December 16, 2024

**Copyright:** © 2024 Huybrechts et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: The data analyzed in this study is subject to the following licenses/ restrictions: EPIC data and biospecimens are available for investigators who seek to answer important questions on health and disease in the context of research projects that are consistent with the legal and ethical standard practices of IARC/WHO and the EPIC centres. The primary responsibility for accessing the data, belongs to the EPIC centres that provided them. The use of a random sample of anonymised data from the EPIC study can be requested by contacting epic@iarc. RESEARCH ARTICLE

# Associations between dietary mycotoxins exposures and risk of hepatocellular carcinoma in a European cohort

Inge Huybrechts<sup>1,2‡</sup>, Inarie Jacobs<sup>1‡</sup>\*, Carine Biessy<sup>1</sup>, Elom K. Aglago<sup>1</sup>, Mazda Jenab<sup>1</sup>, Liesel Claeys<sup>2,3</sup>, Jiri Zavadil<sup>3</sup>, Corinne Casagrande<sup>1</sup>, Genevieve Nicolas<sup>1</sup>, Ghislaine Scelo<sup>1</sup>, Andrea Altieri<sup>4</sup>, Beatrice Fervers<sup>5</sup>, Isabelle P. Oswald<sup>6</sup>, Julien Vignard<sup>6</sup>, Bernadette Chimera<sup>1</sup>, Maria Santucci de Magistris<sup>7</sup>, Giovanna Masala<sup>8</sup>, Domenico Palli<sup>8</sup>, Lisa Padroni<sup>9</sup>, Jesús Castilla<sup>10,11</sup>, Ana Jiménez-Zabala<sup>11,12,13</sup>, Pauline Frenoy<sup>14</sup>, Francesca Romana Mancini<sup>14</sup>, Xuan Ren<sup>14</sup>, Emily Sonestedt<sup>15</sup>, Paolo Vineis<sup>16</sup>, Alicia Heath<sup>16</sup>, Mårten Werner<sup>17</sup>, Esther Molina-Montes<sup>11,18,19,20</sup>, Christina C. Dahm<sup>21</sup>, Fie Langman<sup>21</sup>, José María Huerta<sup>11,22</sup>, Magritt Brustad<sup>23,24</sup>, Guri Skeie<sup>23</sup>, Matthias B. Schulze<sup>25,26</sup>, Antonio Agudo<sup>27,28</sup>, Sabina Sieri<sup>29</sup>, Michael Korenjak<sup>3</sup>, Marc J. Gunter<sup>1,16</sup>, Sarah De Saeger<sup>2,30‡</sup>, Marthe De Boevre<sup>2,30‡</sup>\*

1 International Agency for Research on Cancer (IARC/WHO), Nutrition and Metabolism Branch, Lyon, France, 2 CRIG, Cancer Research Institute Ghent, Ghent, Belgium, 3 International Agency for Research on Cancer (IARC/WHO), Epigenomics and Mechanisms Branch, Lyon, France, 4 European Food Safety Authority (EFSA), Parma, Italy, 5 Centre Léon Bérard, Lyon, France, 6 Toxalim (Research Centre in Food Toxicology), INRAE, ENVT, INP-Purpan, UPS, Université de Toulouse, Toulouse, France, 7 Azienda Ospedaliera Universitaria (AOU) Federico II, Naples, Italy, 8 Institute for Cancer Research, Prevention and Clinical Network (ISPRO), Florence, Italy, 9 Unit of Cancer Epidemiology, Città della Salute e della Scienza University-Hospital and Center for Cancer Prevention (CPO), Turin, Italy, 10 Instituto de Salud Pública de Navarra-IdiSNA, Pamplona, Spain, 11 CIBER of Epidemiology and Public Health (CIBERESP), Madrid. Spain, 12 Ministry of Health of the Basque Government, Sub Directorate for Public Health and Addictions of Gipuzkoa, San Sebastian, Spain, 13 BioGipuzkoa Health Research Institute, Epidemiology of Chronic and Communicable Diseases Group, San Sebastián, Spain, 14 UVSQ, Inserm "Exposome, Heredity, Cancer and Health" Team, CESP U1018, Gustave Roussy, Université Paris-Saclay, Villejuif, France, 15 Department of Clinical Sciences Malmö, Lund University, Malmö, Sweden, 16 Cancer Epidemiology and Prevention Research Unit, School of Public Health, Imperial College London, London, United Kingdom, 17 Department of Public Health and Clinikal Medicine, Umeå University, Umeå, Sweden, 18 Department of Nutrition and Food Science, Campus of Cartuja, University of Granada, Granada, Spain, 19 Instituto de Investigación Biosanitaria ibs.GRANADA, Granada, Spain, 20 Institute of Nutrition and Food Technology (INYTA) 'José Mataix', Biomedical Research Centre, University of Granada, Granada, Spain, 21 Dept. of Public Health, Aarhus University, Aarhus, Denmark, 22 Department of Epidemiology, Murcia Regional Health Council-IMIB, Murcia, Spain, 23 Department of Community Medicine, Faculty of Health Sciences, UiT The Arctic University of Norway, Tromsø, Norway, 24 The Public Dental Health Service Competence Centre of Northern Norway, Tromsø, Norway, 25 Department of Molecular Epidemiology, German Institute of Human Nutrition Potsdam-Rehbruecke, Nuthetal, Germany, 26 Institute of Nutritional Science, University of Potsdam, Nuthetal, Germany, 27 Unit of Nutrition and Cancer, Catalan Institute of Oncology - ICO, L'Hospitalet de Llobregat, Spain, 28 Nutrition and Cancer Group, Bellvitge Biomedical Research Institute - IDIBELL, L'Hospitalet de Llobregat, Spain, 29 Epidemiology and Prevention Unit, Fondazione IRCCS Istituto Nazionale dei Tumori. Milan, Italy, 30 Centre of Excellence in Mycotoxicology and Public Health, Ghent University, Ghent, Belgium

‡ IH and IJ are equally contributed to this manuscript [shared first authors] and SS and MB are equally contributed to this manuscript [shared senior authors]
\* incode @incode up int (1): months debeaure @urged to (MB)

\* jacobsi@iarc.who.int (IJ); marthe.deboevre@ugent.be (MB)

# Abstract

Mycotoxins have been hypothesized to contribute to a diversity of adverse health effects in humans, even at low concentrations. Certain mycotoxins are established human

who.int. The request will then be passed to members of the EPIC Steering Committee for deliberation. Further information is available at https://epic.iarc.fr/access/

Funding: The following author(s) declare financial support was received for the research, authorship, and/or publication of this article: IH were funded by the European Union's Horizon 2020 research and innovation programme under grant agreements No: 874627 (EXPANSE) https://www.catalyze-group.com/horizon-europe-funding/?utm\_campaign=Horizon%20Europe&utm\_term=Horizon%20Europe%20funding&gad\_source= 1&gclid=

carcinogens, whereas for others research suggests potential carcinogenic effects. The aim of this study was to determine the association between dietary exposure to mycotoxins and hepatobiliary cancers in the European Prospective Investigation into Cancer and Nutrition (EPIC) cohort. EPIC guestionnaire data were matched to mycotoxin food occurrence data compiled by the European Food Safety Authority to assess long-term dietary mycotoxin exposure (expressed as µg/kg body weight/day) and then relate them to the risk of hepatocellular carcinoma (HCC) (n = 255) and biliary tract cancers (n = 273). Analyses were conducted using multivariable Cox proportional hazards regression models to compute hazard ratios (HR) and 95% confidence intervals (95% CI). Key food groups contributing to mycotoxin exposure were cereals and cereal-based products, vegetables, non-alcoholic beverages (including fruit juices) and fruits. Estimated intake of deoxynivalenol (DON) and its derivatives was positively associated with HCC risk (HR<sub>T3vsT1</sub>: 1.90, 95% CI: 1.18–3.05, ptrend <0.01). No statistically significant associations were found for the other mycotoxins. Further research to confirm our observations and investigate potential underlying mechanisms of these compounds is warranted. These data may provide evidence of HCC risks associated with higher dietary intake levels of DON, which has not yet been classified as a human carcinogen.

# Introduction

Liver cancer is the sixth most frequently diagnosed cancer worldwide with an estimated 1 053 619 new cases in 2030 and an age-standardized incidence rate of 8.6 per 100,000 person-years [1]. Liver cancer is one of the deadliest cancers, with an age-standardized annual mortality rate of 7.4 per 100,000 person-years [1]. Liver cancer incidence and mortality continue to rise, despite advances in prevention strategies and new technologies in both diagnosis and treatment [2]. Liver cirrhosis is the most important risk factor for the development of hepatocellular carcinoma (HCC, which comprise the majority of liver cancers), with hepatitis B and C and alcohol consumption, unhealthy dietary patterns, smoking and obesity being among other major risk factors for the development of liver cirrhosis [3].

Mycotoxins are fungal secondary metabolites that contaminate many of the most frequently consumed foods worldwide, such as grains, nuts, fruits and legumes [4–6]. One fungal species may produce many different mycotoxins, and the same mycotoxin may also be produced by several different fungal species [5, 6]. Recent reports revealed that 60% to 80% of the world's food crops are contaminated by mycotoxins, resulting in a widespread human exposure to one or more mycotoxins, through consumption of cereal-based foods, nuts, fruits, coffee, spices, and oil-based seeds [7–9]. Chronic exposure to mycotoxins, such as aflatoxins (AFs), have been classified as potent human hepatocarcinogens [10–12].

Numerous mycotoxins have been identified but the mycotoxins most commonly related to human health include AFs, ochratoxin A, patulin, fumonisins, zearalenone and nivalenol/ deoxynivalenol (see <u>S1 Table</u>) [13]. The International Agency for Research on Cancer (IARC) identifies the individual AFs B1 (AFB1), B2 (AFB2), G1 (AFG1), G2 (AFG2) and M1 (AFM1) as sufficiently evident human carcinogens, while other mycotoxins are designated as possible carcinogens (*e.g.*, ochratoxin A (OTA), fumonisin B1 (FB1) fumonisin B2 (FB2). Recent research indicates that exposure to multiple mycotoxins have a potentially increased carcinogenic effect over single mycotoxins [14–17].

The primary target organ for many mycotoxins is the liver, evidenced especially by their association with HCC [18], where they are metabolized, though not always inactivated [19–21]. There is a strong, established link between AFs exposure and development of HCC [12, 17, 21]. The World Cancer Research Fund (WCRF) has further concluded strong evidence linking AF-contaminated foods with liver cancer risk [22]. The associated mechanism possibly involves metabolization of AFB1 in the liver to a highly reactive species, capable of forming mutagenic DNA-adducts. Subsequently, a synergistic effect promoting tumour growth in the liver has been reported for co-exposure to AFB1 and FB1 [23]. Less pronounced effects were reported in a meta-analysis on co-exposure to OTA, also resulting in increased hepatic lipid levels and increased relative weight of the organ [4].

Recent reports identify various food safety issues such as the presence of mycotoxins, likely to be affected by climate change, particularly in Europe. Fungal shifts towards northern latitudes due to warmer conditions give rise to a subsequent emerging pattern of mycotoxins in different regions in Europe [24–27]. Given the ubiquitous nature of exposures to multiple mycotoxins in many countries, it is imperative to comprehensively investigate their hepatocarcinogenic potency, by means of longitudinal cohort data. Therefore, this manuscript determines the association between mycotoxin exposures and incidence of HCC cancer using a large-scale multinational European cohort study.

## Materials and methods

# Subjects and study design

The European Prospective Investigation into Cancer and Nutrition (EPIC) study is a large ongoing multicentre prospective cohort study consisting of 521,323 adults (367,898 women and 153,425 men) mostly recruited aged 35–70 years from whom diet, and lifestyle data were collected at baseline. The participants were enrolled between 1992 and 2000 from 23 centres in 10 European countries: Denmark, France, Germany, Italy, The Netherlands, Norway, Spain, Greece, Sweden and the United Kingdom [28]. The rationale, study population and data collection have been described elsewhere [29]. All participants provided written informed consent and the ethical review boards from IARC and from all local centres approved the study. Participants with prevalent cancer at baseline (n = 25,184), and with missing information on lifestyle or dietary information (n = 6,259), follow-up information (n = 4,148), or in the highest and lowest distribution percentiles for the ratio energy intake to estimated energy requirement (n = 9,573) were excluded from the analysis. Data from Greek participants (n = 26,048) were not available. The final study population included 450,112 participants (70% females).

#### Dietary data and lifestyle questionnaires

**Dietary questionnaires.** Usual dietary intake was assessed at study baseline using validated country or centre-specific dietary questionnaires (DQs) [29]. In most centres, DQs were self-administered, except for Ragusa (Italy), Naples (Italy), and Spain, where face-to-face interviews were performed. Semi-quantitative DQs were used in Italy, the Netherlands and Denmark, while diet history questionnaires were structured by meals in Spain and France. Foodfrequency questionnaires (FFQs) were used in Germany, the United Kingdom, and Umeå (Sweden). A method combining a short FFQ with a 7-day record on hot meals was used in Malmö (Sweden). The nutritional values of consumed foods were taken from the EPIC Nutrient Database (ENDB), compiled using a highly standardised procedure, adopting nutrient values from the national food composition databases of the respective EPIC countries. The process for compiling this ENDB database has been previously described [30]. Information on physical activity, history of tobacco smoking, alcohol consumption and education were collected at baseline by questionnaires. Weight and height were measured at the baseline examination in all centres except from part of Oxford, France and Norway, where weight and height were self-reported [28].

**Mycotoxin occurrence data.** The European Food Safety Authority (EFSA) is an agency of the European Union (EU), tasked with performing risk assessments regarding safety of foods for human consumption and feeds for livestock. The EFSA databases relevant to this project record mycotoxin occurrences of all types of mycotoxins, filed in Europe and obtained via the European members states. EFSA provides guidance to report analysed data, when launching calls for data to the member states. For this study, mycotoxin occurrence data derived from the EFSA database was used and matched with the EPIC food consumption data derived from the dietary questionnaires. Mycotoxin contents of foods analysed from 1998 to 2013, as provided by EFSA, were used for these analyses. To calculate the quantity of each mycotoxin consumed by a specific individual, the portion (in grams) of every food that was consumed by each participant (as reported in the DQs) was linked to the mycotoxin occurrence data (196 321 food samples analysed overall) for that particular food [9]. Unfortunately, the data did not allow country-specific matching between the dietary intake data and the food occurrence data [9].

**Mycotoxin concentration scenarios assigned to non-detect samples.** When reporting contaminant concentrations analysed in monitoring programmes, actual numeric values of concentrations are only reported when the measurements exceed the limit of detection (LOD) or limit of quantification (LOQ). If less than these limits, samples are classified as non-detect samples. To calculate exposures for these non-detect samples, a medium bound (MB)-concentration scenario was applied in which all non-detected samples of commodities (including drinking water) with at least one sample with a concentration at or above the LOD or LOQ were assigned a concentration equal to half the limit value. The remaining non-detect samples were assumed to contain no mycotoxins. This scenario was chosen as opposed to assigning all non-detect samples a concentration equal to 0  $\mu$ g/kg (so called lower bound scenario) to link the analysed concentrations to the foods consumed. However, also the lower bound scenario was used in this study for conducting sensitivity analyses.

Mycotoxin grouping for analysis. Groups of related mycotoxins were determined according to certain families depending on their chemical structure. Concentration levels were computed by summing the levels of mycotoxins in the group. The group Aflatoxins included AFB1, AFB2, AFG1, AFG2, AFM1. The group Deoxynivalenol (DON) and derivatives included DON, 3-acetyl-DON (3-ADON), 15-acetyl-DON (15-ADON) and deoxynivalenol-3-glucoside (DON3G). The Fumonisins group included fumonisin B1 (FB1), fumonisin B2 (FB2) and fumonisin B3 (FB3). Zearalenone and derivatives were compiled by the zearalenone (ZEN), zearalenone-derivatives (ZEN-dv), zearalenols (ZEL) including $\alpha$ -zearalenol (A\_ZEL) and  $\beta$ zearalenol (B\_ZEL), and zearalanone (ZAN). The group Alternaria toxins included alternariol (AOH), alternariol mono-methylether (AME), altenuene (ALT), tenuazonic acid (TEA), altertoxin (ATX), tenuazonic acid (TEN) and AAL-toxins (AAL\_toxins). The group Enniatins included enniatin A (ENN A), enniatin A1 (ENN A1), enniatin B (ENN B) and enniatin B1 (ENN B1). The group *Ergot alkaloids* included ergocornine (Eco), ergocorninine (Econ), ergocristine (Ecr), ergocristinine (Ecrn),  $\alpha$ -ergokryptine (Ek),  $\alpha$ -ergokryptinine (Ekn), ergometrine (Em), ergometrinine (Emn), ergosine (Es), ergosinine (Esn), ergotamine (Et) and ergotaminine (Etn). The group Ochratoxins included OTA. The group T2 & HT2 included HT-2 toxin (HT2) and T-2 toxin (T2). Other mycotoxins were handled individually: patulin (PAT), nivalenol (NIV), diacetoxyscirpenol (DAS), fusarenon-X (FUS-X), moniliformin (MON), citrinin (CIT), beauvericin (BEAU) and sterigmatocystin (STC) (see S2 Table).

**Follow-up for cancer incidence and vital status.** Incident cancer cases were identified through several methods, including record linkage with population-based cancer registries,

health insurance records, pathology registries, and active follow-up of study participants and their close kinship. Data on vital status were obtained from mortality registries, in combination with data collected through active follow-up in some of the centres. Exit time was the age at whichever of the following came first: liver cancer diagnosis, death, or the last date at which follow-up was considered complete.

For HCC, cases were defined as first incident primary cancer and were coded according to the International Classification of Diseases for Oncology (ICD-O) [31]. HCC was defined as C22.0 with morphology codes ICD-O-2 "8170/3", 8171/3 and "8180/3" and IHBC as C22.1 (all morphology codes except ICD-O-2 "8162/3" which was recoded as extrahepatic bile duct). For each identified HCC case, the histology, and the methods, used to diagnose the cancer, were reviewed by a pathologist to exclude metastatic cases or other types of primary liver cancers. In addition (as part of secondary objective), malignant neoplasm of gallbladder (C23) and malignant neoplasm of other and unspecified parts of biliary tract (C24) were included. Our definition of gallbladder and biliary tract cancers (GBTC) includes tumours in the gallbladder (C23.9 (morphology codes: 8000/3, 8010/2, 8010/3, 8020/3, 8140/3, 8160/3, 8260/3, 8480/3, 8490/3, 8162/3, 8260/3)), extrahepatic bile ducts (C24.0 (morphology codes: 8000/3, 8010/3, 8140/3, 8160/3, 8160/3, 8160/3, 8160/3, 8160/3, 8160/3)), and overlapping (C24.8 (morphology codes: 8000/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 800/3, 8010/3, 8010/3, 800/3, 8010/3, 800/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8000/3, 8010/3, 8010/3, 8000/3, 8010/3, 8010/3, 8000/3, 8010/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8000/3, 8000/3, 8010/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8000/3, 8010/3, 8010/3, 8000/3, 8010/3, 8010/3, 8010/3, 8000/3, 8010/3, 8000/3, 8001/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8000/3, 8000/3, 8001/3, 8010/3, 8010/3, 8010/3, 8010/3, 8010/3, 8000/3,

Statistical analysis. Analyses of the association between dietary multi-mycotoxin exposures with hepatobiliary cancer risk were conducted by performing Cox proportional hazards regression estimating hazard ratios (HRs) and 95% confidence intervals (CIs). Tertiles of each mycotoxin were used to calculate the associated hazard ratios. Time at risk was estimated from the time of recruitment to the time of death, emigration, loss to follow-up, or the end of followup period (a maximum through 2014 depending on centre), whichever occurred first. To control for differences in questionnaire design and follow-up procedures, models were further stratified by age at recruitment (one-year category) and sex. The entry time was defined as age at recruitment, while exit time was age occurrence of the event (*i.e.*, age at last follow-up, first diagnosis of incident cancer, loss to follow-up, or death, whichever came first). Trend tests across levels of exposure were performed on standardized continuous variables (association per 1 SD increase), while for categorical variables the test has been computed by assigning consecutive scores to the categories (sex-specific tertiles) as an ordinal variable (1 to 3). Finally, confounding factors remained in the models if the  $\beta$ -estimate changed by more than 10%. On the basis of these conditions, common adjustments factors included highest level of attained education (none or primary school completed, technical/professional school or secondary school, longer education, not specified), body mass index (BMI continuous), total energy intake (continuous in Kcal/day), coffee consumption (continuous in g/day), alcohol intake at recruitment (continuous in g/day) and lifetime alcohol intake (continuous in g/day), smoking status (never, former, current, missing), self-reported diabetes (type 1 and 2) at baseline (yes, no, missing), and physical activity (inactive or moderately inactive, moderately active or active, missing).

Analyses were based on mycotoxin intakes (in  $\mu$ g) divided by kilos of body weight (most common mode of expression). Although our main objective was to investigate associations between the individual mycotoxins and HCC, some extra explorative analyses were run, investigating potential effects of total multi-mycotoxins exposures and with groups of mycotoxins by summing the levels of mycotoxins belonging to certain families depending on their physicochemical properties. We computed the trend on the standardized continuous variable as the interpretation is easier and comparable across the different mycotoxins for which the levels can be very different.

For sensitivity analyses, models were fitted for men and women, separately. Multivariable models were adjusted for known or suspected risk factors, sex, age, and study centre for each liver cancer based on the findings of the World Cancer Research Fund/American Institute for Cancer Research [22]. Additionally, sensitivity analyses were conducted without adjustment for coffee consumption and extra analyses were run in a sub-cohort in which information on hepatitis infection status was available from case-control studies nested in EPIC, allowing extra adjustment for hepatitis infection.

Statistical analyses were performed with the SAS, version 9.4 statistical software package. All tests of statistical significance were two-sided and P-values below 0.01 were considered significant (after adjusting for multiple testing). The association between mycotoxins and HCC was explored in multivariate conditional regression models using the Benjamini-Hochberg correction to control for multiple comparisons [32].

## **Results and discussion**

Descriptive analyses indicated differences between the hepatobiliary cancer cases (N = 255) and the non-cases for age at recruitment, BMI, alcohol consumption, sex, smoking status, energy intake and the percentage classified as physically inactive and with diagnosed diabetes (Table 1).

A large part of the EPIC population is being exposed to some of the main mycotoxins present in foods, although for most of the mycotoxins, only a small percentage of the population has exposures above the Tolerable Daily Intake (TDI) (Table 2). For mycotoxins like AFs and STC for which a tolerable intake of  $0 \mu g/kg$  body weight (*cf.* as low as reasonably achievable (ALARA)-principle) is considered, nearly the whole population showed an intake above this 0-value leading to almost 100% of the population with intakes higher than the TDI in the MB scenario (Table 2B). For all other mycotoxins the percentage of the population that had intakes above the TDI (according to middle bound values) was rather low (ranging from 0% for FB up close to 3% for DAS) in the MB scenario (Table 2B).

S3–S6 Tables presents a description of the external mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort for lower bound values and middle bound value for  $\mu$ g/d and  $\mu$ g/kg body weight/d. For some of the mycotoxins such as citrinin, only few insignificant values had been measured/detected in the foods that were analysed by the member states (see lower bound scenario equal to zero for all percentiles). However, low values were assigned when the measurement was below the LOD or LOQ in the middle-bound scenario where half of the LOD or LOQ was considered for the MB scenario.

Associations between mycotoxin exposures and liver cancer risk were investigated and have shown an increased risk for DON with HCC, which remained significant in the fully adjusted model ( $HR_{T3vsT1}$  (95%CI) = 1.90 (1.18–3.05), p-trend = 0.0079) (Table 3). It is note-worthy that an inverse association was found for MON and HCC ( $HR_{T3vsT1}$  (95%CI) = 0.65 (0.43–0.99), p-trend = 0.042) and Citrinin and HCC ( $HR_{T3vsT1}$  (95%CI) = 0.59 (0.39–0.89), p-trend = 0.013. No significant risks were found for the other mycotoxins in the fully adjusted model. Sensitivity analysis in which we additionally adjust for hepatitis infection in a subsample of the cohort for which hepatitis infection status was available confirmed these statistically significant associations for DON ( $HR_{T3vsT1}$  (95%CI) = 2.25 (1.11–4.57)) while no significant associations were found for the other mycotoxins (although same positive trend was found, results were attenuated due to reduced power and limited number of cases with hepatitis and should therefore be interpreted with caution; S7 Table). Results for the model that does not include coffee consumption as potential confounding factor were similar to those of the fully adjusted model and are included as S8 Table. Sensitivity analysis showed that results obtained

#### Table 1. Characteristics of the EPIC study participants.

Total number of samples after exclusions = 450,112	HCC (	Cases	Non-HCC cases N = 449,857		
	N = 2	255			
	Mean	SD	Mean	SD	
Body Mass Index (kg/m <sup>2</sup> )	28.3	5.1	25.3	4.2	
Age at recruitment (years)	58.2	6.9	51.1	9.8	
Energy intake USDA (kcal)	2270.9	702.2	2076.4	618.7	
Alcohol intake at recruitment (g/d)	23.4	35.4	11.7	16.8	
Length of follow-up (years)	9.6	4.9	14.1	3.9	
	n	%	n	%	
Sex					
Male	162	63.5	131 264	29.2	
Female	93	36.5	318 593	70.8	
Education					
None	10	3.9	15 541	3.5	
Primary school completed	104	40.8	110 960	24.7	
Technical/professional school	65	25.5	103 718	23.1	
Secondary school	25	9.8	93 885	20.9	
Longer education (incl. University deg.)	44	17.3	108 887	24.2	
Missing	7	2.7	168 66	3.7	
Physical activity					
Inactive			87 950	19.6	
Moderately inactive	82	32.2	149 867	33.3	
Moderately active	74	29	120 153	26.7	
Active	46	18	83 063	18.5	
Missing	53	20.8	8 824	2.0	
Diabetes					
No	195	76.5	400 257	89.0	
Yes	31	12.2	10 707	2.4	
Missing	29	11.4	38 893	8.6	
Smoking status					
Never	75	29.4	219 219	48.7	
Former	79	31	122 601	27.3	
Smoker	99	38.8	99 616	22.1	
Missing	2	0.8	8 421	1.9	
Hepatitis status*					
No	69	67.7	700	94.9	
Yes	33	32.3	38	5.1	

HCC: hepatocellular carcinoma

https://doi.org/10.1371/journal.pone.0315561.t001

in <u>Table 3</u> did not differ between male and female participants (although same positive trend was found, this was attenuated for women due to reduced power and limited number of cases for women and should therefore be interpreted with caution; <u>S9 Table</u>). Additional analysis was performed to investigate the associations between mycotoxin exposure and intrahepatic biliary tract cancer risk, extra-hepatic biliary tract cancer risk and gall bladder and biliary tract cancer risk. No significant risks were found in this analysis (<u>S10–S12</u> Tables).

Additional analyses identifying the most important food groups contributing to these mycotoxins' exposures revealed relevant contributors to be cereals and cereal products

	(A) Lowe	er Bound (LB) - με	g/kg body weight			
LABEL (expressed in -µg/kg body weight)	Туре	Cut-off	N < = cut-off	%	N > cut-off	%
Ergot alkaloids LB [ <u>33</u> ]	TDI	0.6	476,760	99.998	9	0.002
Ochratoxins sum LB [34]	TDI	0.016	476,637	99.972	132	0.028
Ochratoxins sum LB [34]	PTWI	0.112	476,769	100	0	0
Ochratoxins sum LB [ <u>34</u> ]	TWI	0.1714	476,769	100	0	0
Aflatoxin sum LB [35]	TDI	0	7,459	1.564	469,310	98.436
Aflatoxin sum LB [35]	BMDL	0.17	476,769	100	0	0
Patulin LB [36]	TDI	0.4	476,769	100	0	0
Deoxynivalenol & deriv. LB [37]	PMTDI	1	476,757	99.997	12	0.003
T-2/HT-2 toxins sum LB [38]	TDI	0.1	476,769	100	0	0
Nivalenol LB [ <u>39</u> ]	TDI	1.2	476,769	100	0	0
Nivalenol LB [ <u>39</u> ]	TDI	0.7	476,769	100	0	0
Fumonisins sum LB [40]	TDI	2	476,766	99.999	3	0.001
Diacetoxyscirpenol LB [41]	TDI	0.06	476,769	100	0	0
Zearalenone & deriv. SUM LB [42]	TDI	0.25	476,557	99.956	212	0.044
Sterigmatocystin LB [43]	TDI	0	476,769	100	0	0
	(B) Midd	le Bound (MB) - μ	g/kg body weight			
LABEL (expressed in -µg/kg body weight)	Туре	Cut-off	N < = cut-off	%	N > cut-off	%
Ergot alkaloids MB [ <u>33</u> ]	TDI	0.6	476,658	99.977	111	0.023
Ergot alkaloids MB [ <u>33</u> ]	ARfD	1	476,764	99.999	5	0.001
Ochratoxins sum MB [34]	TDI	0.016	476,576	99.96	193	0.04
Ochratoxins sum MB [34]	PTWI	0.112	476,769	100	0	0
Ochratoxins sum MB [34]	TWI	0.1714	476,769	100	0	0
Aflatoxin sum MB [35]	TDI	0	0	0	476,769	100
Aflatoxin sum MB [35]	BMDL	0.17	476,769	100	0	0
Patulin MB [ <u>36</u> ]	TDI	0.4	476,769	100	0	0
Deoxynivalenol & deriv. MB [37]	PMTDI	1	476,422	99.927	347	0.073
T-2/HT-2 toxins sum MB [38]	TDI	0.1	476,759	99.998	10	0.002
Nivalenol MB [ <u>39</u> ]	TDI	1.2	476,769	100	0	0
Nivalenol MB [39]	TDI	0.7	476,769	100	0	0
Fumonisins sum MB [40]	TDI	2	476,766	99.999	3	0.001
Diacetoxyscirpenol MB [ <u>41</u> ]	TDI	0.06	463,493	97.215	13,276	2.785
Zearalenone & deriv. SUM MB [42]	TDI	0.25	476,385	99.919	384	0.081
Sterigmatocystin MB [43]	TDI	0	1,707	0.358	475,062	99.642

Table 2. Percentage of the population below and above the safety reference values for external mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort (Table 2A: lower bound values; Table 2B: middle bound values). . .- - .

TDI; tolerable daily intake, TWI; tolerable weekly intake, PMTDI, provisional maximum tolerable daily intake, PTWI; provisional tolerable weekly intake Mycotoxins for which only insignificant values have been detected are written in Italic font (Diacetoxyscirpenol, Sterigmatocystin).

https://doi.org/10.1371/journal.pone.0315561.t002

(39.1%), vegetables (20.3%), and the group of fruits, nuts and seeds (11.7%). Within the other food groups, we found very low or no concentrations of any mycotoxin, except for ZEN and AFM1 that are present in dairy products and patulin present in non-alcoholic beverages (including fruit juices) (S13 Table).

The results presented in this manuscript indicates the potential importance of investigating mycotoxin exposures in Europe. The external exposure analyses using EPIC dietary questionnaire data shows possible important exposures to particular mycotoxins in European countries. Our findings indicate a potentially increased HCC risk with higher exposures to the

	MB (middle bound)	HCC (body weight)				
	Mycotoxins µg/BW/day	Cases 255	HR	95% CI	Probability Chi Square	Ptrend
Ergot alkaloids	Per 1 SD increase		1.03	0.87-1.23	0.7253	
	T1	72	1	Ref.		
	T2	96	0.99	0.63-1.56	0.9769	0.6304
	Т3	87	1.12	0.66-1.91	0.6674	
Ochratoxins	Per 1 SD increase		1.01	0.82-1.25	0.9078	
	T1	105	1	Ref.		
	T2	79	0.88	0.61-1.26	0.4762	0.6568
	Т3	71	0.91	0.59-1.41	0.6765	
Aflatoxins	Per 1 SD increase		0.97	0.77-1.23	0.8064	
	T1	114	1	Ref.		
	T2	85	0.93	0.64-1.33	0.6750	0.5640
	Т3	56	0.88	0.55-1.39	0.5721	•
Patulin	Per 1 SD increase		1.28	1.16-1.41	< .0001	
	T1	82	1	Ref.		
	T2	78	0.92	0.63-1.35	0.6814	0.1340
	Т3	95	1.32	0.91-1.92	0.1440	
Deoxynivalenol and derivatives	Per 1 SD increase		1.12	0.96-1.30	0.1600	
	T1	85	1	Ref.		
	T2	74	1.22	0.81-1.82	0.3389	0.0079
	T3	96	1.9	1.18-3.05	0.0084	•
T-2/HT-2 toxins	Per 1 SD increase		1.20	1.02-1.40	0.0249	
	T1	84	1	Ref.		
	T2	68	0.84	0.57-1.25	0.3955	0.1813
	T3	103	1.28	0.86-1.91	0.2240	
Nivalenol	Per 1 SD increase		1.04	0.86-1.25	0.6836	
	T1	88	1	Ref.		
	T2	77	0.87	0.58-1.30	0.4881	0.2349
	T3	90	1.31	0.83-2.07	0.2444	
Fumonisins	Per 1 SD increase		1.07	0.89-1.29	0.4436	
	T1	97	1	Ref.		
	T2	74	0.97	0.66-1.43	0.8784	0.4668
	Т3	84	1.18	0.75-1.84	0.4710	•
Diacetoxyscirpenol	Per 1 SD increase		0.98	0.86-1.12	0.7729	•
	T1	109	1	Ref.		•
	T2	76	0.97	0.67-1.42	0.8905	0.9254
	<i>T</i> 3	70	0.98	0.61-1.56	0.9323	•
Zearalenone & derivatives	Per 1 SD increase		1.01	0.83-1.24	0.9026	•
	T1	104	1	Ref.		•
	T2	81	0.92	0.62-1.34	0.6495	0.2590
	Т3	70	0.76	0.47-1.22	0.2544	
Fusarium Toxins	Per 1 SD increase	L	1.11	0.93-1.33	0.2424	
	T1	89	1	Ref.		
	T2	80	1.21	0.82-1.80	0.3310	0.1148
	T3	86	1.46	0.91-2.35	0.1150	
Fusarenon X	Per 1 SD increase		1.18	0.97-1.42	0.0958	

Table 3. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin (body weight) exposures and liver cancer risk using a fully adjusted model\*. P-value of 0.01 was considered statistically significant (after Bonferroni correction).

(Continued)

	MB (middle bound)	HCC (body weight)					
	Mycotoxins µg/BW/day	Cases 255	HR	95% CI	Probability Chi Square	Ptrend	
	T1	80	1	Ref.			
	T2	79	1.08	0.73-1.59	0.7111	0.1069	
	T3	96	1.45	0.92-2.28	0.1083		
Sterigmatocystin	Per 1 SD increase		0.79	0.55-1.13	0.1941		
	<i>T1</i>	111	1	Ref.			
	T2	84	1.02	0.73-1.41	0.9092	0.1070	
	T3	60	0.65	0.42-1.02	0.0621		
Moniliformine	Per 1 SD increase		0.98	0.80-1.20	0.8427		
	T1	102	1	Ref.			
	T2	81	0.82	0.58-1.17	0.2767	0.0429	
	Т3	72	0.65	0.43-0.99	0.0451		
Alternaria toxins	Per 1 unit increase		1.17	0.94-1.45	0.1640		
	T1	69	1	Ref.			
	T2	98	1.52	1.02-2.28	0.0398	0.0826	
	Т3	88	1.58	0.95-2.62	0.0755		
Citrinin	Per 1 SD increase		0.83	0.67-1.02	0.0758		
	<i>T1</i>	99	1	Ref.			
	T2	86	0.89	0.63-1.26	0.5201	0.0138	
	<i>T</i> 3	70	0.59	0.39–0.89	0.0121		
Enniatins	Per 1 SD increase		0.99	0.78-1.26	0.9433		
	T1	83	1	Ref.			
	T2	80	0.98	0.67-1.45	0.9336	0.8460	
	Т3	92	1.07	0.62-1.83	0.8167		
Sum of Mycotoxins	Per 1 SD increase		1.16	0.95-1.43	0.1465		
	T1	78	1	Ref.			
	T2	87	1.41	0.94-2.11	0.0953	0.0501	
	Т3	90	1.66	1.00-2.74	0.0488		
Sum of Mycotoxins, using z-scores	Per 1 SD increase		1.06	0.85-1.32	0.5892		
	T1	86	1	Ref.			
	T2	86	1.10	0.75-1.63	0.6191	0.5196	
	Т3	83	1.18	0.72-1.93	0.5207		

#### Table 3. (Continued)

T1; Tertile 1, T2; Tertile 2, T3; Tertile 3, HCC; Hepatocellular carcinom

(\*) Fully adjusted model: Energy intake, BMI, Alcohol at recruitment & lifetime alcohol intake, Physical activity index, Smoking status, Education and Diabetes and Coffee consumption

Mycotoxins for which only insignificant values have been detected are written in Italic font (Citrinin, Diacetoxyscirpenol, Fusarenon X, Sterigmatocystin).

https://doi.org/10.1371/journal.pone.0315561.t003

ubiquitously present *Fusarium*-toxin DON. Interestingly, no significant associations were found with other mycotoxins including *Aspergillus*-toxins, especially AFB1, a well-established liver carcinogen designated as a Group 1 human carcinogen by IARC (due to its genotoxic and mutational effects that are considered the main mechanism of action for AFB1) and suggested to induce persistent epigenomic effects (*i.e.* methyl DNA-mRNA-interactions) in primary human hepatocytes associated with HCC [44]. This lack of association with AFB1 in our study may be because exposures in Europe are very low, in contrast to DON which is ubiquitous in European diets. Indeed, several studies conducted in various European countries indicate that more than 50% of cereals are contaminated with DON [45].

DON targets the ribosome and induces activation of mitogen-activated protein kinases (MAPKs), the key transducers of the ribotoxic stress response [46, 47]. Inflammation, apoptosis as well as cell cycle arrest, endoplasmic reticulum stress, oxidative stress, and autophagy of the chaperone GRP78 are the main cellular effects of DON. Pathological sequelae resulting from chronic low dose exposure include anorexia, impaired weight gain, growth hormone dysregulation, and aberrant IgA production, whereas acute high dose exposure evokes gastroenteritis, emesis, and a shock-like syndrome [48]. It has been concluded that the capacity of DON to evoke ribotoxic stress contributes significantly to its acute and chronic toxic effects *in vivo* [46]. The potential of DON to induce transcription factors in Human Hepatoma cells has been investigated [50]. DON exposure induces decrease in cell viability in a concentration-dependent manner. Treatment of the Hep-G2 liver cell line with 1  $\mu$ M DON resulted in at least 75% cell viability, whereas at high-DON concentrations (10  $\mu$ M) only 15% of the cells showed metabolic activity after 48 h exposure [49]. More recently an inflammatory and apoptotic effect of DON was also observed in mouse precision-cut liver slices [50].

Several *in vivo* studies also demonstrated that mice orally exposed to low a concentration of DON for 28–30 days display low-grade inflammation as measured by cytokine concentrations in the plasma and the expression of inflammatory mRNA biomarkers in different organs including liver [46, 51]. Histological analysis of DON exposed animals also indicates various types of liver damages such as portal and periportal fibrosis [40] and lymphoid depletion [52]. A study aiming to characterize the chronic effects of DON by exposing cancer-prone transgenic p53 heterozygous (p53+/-) male mice and p53 homozygous (p53+/+) male control mice reported that DON was non-carcinogenic, even in the heterozygous p53 genetic background. The hepatic and renal gene expression analyses further confirmed that chronic exposure to DON was non-inflammatory [53].

Besides DON, the cytotoxic effect on HepG2 cells of acetylated DON, namely 3-ADON and 15-ADON, was evaluated by MTT assays. It has been revealed that the strongest toxic effect was observed at 48 h expressed by an IC50 of  $3.6 \pm 1.2 \mu$ M, which was the lowest IC50 observed for 3-ADON at any exposure time [54]. The study demonstrated cytotoxic effects on the HepG2 cell line in a dose-dependent manner for 3-ADON and 15-ADON individually [54].

Moreover, a synergy has been observed between DON and other trichotechenes including the acetylated forms of DON, for both cytotoxic and inflammatory effects [55, 56]. Considering that food is co-contaminated by several trichotechenes this synergy is likely to occur in vivo in humans.

Even though DON has not been classified as to its carcinogenicity for humans, it has been shown to exacerbate the DNA damage induced by various genotoxins as measured by the expression of the marker gH2AX. This effect is observed in vitro and in vivo in combination with model genotoxins with different modes of action, including captan, a pesticide with genotoxic potential, and colibactin, a bacterial genotoxin produced by the intestinal microbiota [47, 57, 58]. It would be of interest to determine to which extend individuals of the EPIC cohort exposed to DON and developing HCC were also exposed to low levels of other genotoxic compounds.

Interestingly, our results showed a possible decreased risk for HCC risk with higher exposure to moniliformin and citrinin (both mainly found in cereals). No other epidemiological studies have reported similar inverse associations between cancer risk and higher exposure to moniliformin, an observation that requires further research. As described in the tables, only insignificant values have been detected for citrinin, as such considered as a potentially less reliable exposure assessment. Our results may be prone to residual confounding bias e.g., dietary patterns consisting of various cereal and cereal products in combination with other positive dietary aspects, which may explain the inverse association observed for moniliformin. Important <u>strengths</u> of this investigation were the access to one of the largest cohort databases currently available for investigating effects of dietary exposures on cancer risk. Strengths of the EPIC study include its large sample size, its prospective design, its long follow-up, and the inclusion of participants from different European countries with harmonised data collection, especially for diet, offering a broad perspective on dietary intakes in Europe. Also, the access to the EFSA mycotoxin occurrence data derived from the European member states and the important support by the EFSA experts were strengths of this study. In addition, the sensitivity analyses performed on the different levels of these analyses underscores the quality of the results obtained in this project.

However, some limitations should be acknowledged. Limitations of this project are the dietary intake assessment methods that were used in EPIC (mostly self-reported dietary questionnaires) which may be prone to reporting bias. Indeed, diet measurement instruments are built to capture the usual dietary intakes of an individual but are still subject to imprecision and inaccuracy. For example, spices are an important source of mycotoxins but are not captured in the EPIC questionnaires which may cause imprecise estimates of the amounts of actual mycotoxins consumed. Also, the mycotoxin levels in foods notably depend on environmental factors like climate and, storage conditions, leading to important variations in mycotoxin concentrations measured in similar foods. However, in epidemiological analysis these variations can unfortunately not be considered. Furthermore, the EFSA food occurrence data has its limitations as food samples have been analysed in different laboratories available all over Europe and disposing of different laboratory infrastructures and methods available and at different timepoints; therefore, not necessarily reflecting the foods consumed in the different EPIC countries and regions. As demonstrated in Table 2, for some of the mycotoxins such as citrinin, only insignificant values had been measured/detected in the foods that were analysed by the EFSA member states, so the values in the Middle-bound scenario were purely based upon the LOD and LOQ values for these mycotoxins. Given the small number of participants exposed (above PMTDI for DON) and the small number of HCC cases, results on DON association with hepatic cancer incidence should be taken cautiously. In addition, caution is needed regarding the extrapolation of these results to the entire European population or to other populations or ethnicities worldwide since this study included volunteers that may be expected to have more health-conscious behaviours (i.e., higher intakes of fruits, vegetables and wholegrains) compared to the general population. Further, in our models, we included all the participants with available dietary intake data, but with potential missing data on other covariates replaced with a missing class or imputation. Although this may have induced some residual confounding bias, a complete case model would lead to a selection towards more compliant participants in an already health-conscious population. In addition, this study used a single assessment of dietary intakes at baseline. Although diet may change over time, it is usually hypothesized that this estimation reflects general eating behaviour throughout middleaged adult life [59]. Finally, this study was based on an observational cohort. Thus, even though our models included a large range of confounding factors, residual confounding cannot be entirely ruled out.

This indirect approach that aims to assess mycotoxin exposures via food consumption data and mycotoxin occurrences in foods, also referred to as 'external exposure' estimation, gives the community a first insight on the global mycotoxin issue at the population level. The 'internal exposure' estimation takes into account additional variables such as mycotoxicokinetics and -dynamics [60]. Therefore, additional information derived from biological markers for internal exposure are needed to characterize the physiological processes involved in any potential relationship between mycotoxin exposures and cancer risk. Investigating the internal exposure is essential to understand the human mycotoxicokinetics and to exclude the possible

confounding issue of heterogeneous distribution of mycotoxins in foods. Hence, a more suitable and reliable mycotoxin exposure assessment can be achieved by the direct measurement of mycotoxin exposure biomarkers. Calculating intake levels from biomarker levels is still challenging, therefore both, external as well as internal exposure assessments are recommended when investigating and tackling health effects of multiple mycotoxin exposures [61]. In addition, although some of the discussed mechanisms described for DON can be related to carcinogenesis, additional mechanistic studies are also needed for improving our understanding regarding the potential carcinogenic effects of DON exposures.

These results demonstrating potential increases in HCC risk due to chronic mycotoxin exposures can help raise awareness of these high-risk contaminants in the general public as well as product development industries and governing regulatory bodies. Several practical primary and secondary prevention strategies exist for minimizing public mycotoxin exposure, which could be highly beneficial, if the requisite political will and financial investment are applied to what remains a largely ignored global health issue [62]. It should be underlined that prevention strategies should not aim at avoiding foods that are more prone for being contaminated with mycotoxins, but rather at eliminating or reducing the contamination level of the foods by improving storage and transportation conditions and detoxification after contamination.

# Conclusions

These analyses showed greater HCC risk associated with long-term dietary exposures to DON. However, validation of these findings in other studies and via biomarkers is necessary. Further research investigating potential mechanisms underlying these putative associations is warranted. Even though DON has not been classified as to its carcinogenicity for humans, this mycotoxin presents a potential threat to human health.

# Supporting information

S1 Table. Mycotoxins classified according to the IARC Monograph that identifies and evaluates environmental causes of cancer in humans. (DOCX)

S2 Table. Complete list of mycotoxin groups and individual mycotoxins included in this study.

(DOCX)

S3 Table. Description of the external mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort for lower bound values in µg/d. (DOCX)

S4 Table. Description of the dietary mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort for middle bound values in  $\mu$ g/d. (DOCX)

S5 Table. Description of the external mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort for lower bound values in  $\mu$ g/kg body weight per day.

(DOCX)

S6 Table. Description of the external mycotoxin exposures assessed based upon dietary questionnaire data for the full EPIC cohort for middle bound values in µg/kg body weight per day. (DOCX)

S7 Table. Odds ratios (OR) and their 95% confidence intervals (CI) for the associations between mycotoxin exposures (μg/BW\*day) and liver cancer risk using an adjusted model\* (with and without adjustment for hepatitis). P-value of 0.01 was considered statistically significant (after Bonferroni correction). (DOCX)

S8 Table. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin exposures (μg/BW\*day) and liver cancer risk using an adjusted model\* (without adjustment for coffee consumption). Both total HCC and the different subsites are presented (n = 450,112; HCC cases = 255 & non-cases = 449,857). P-value of 0.01 was considered statistically significant (after Bonferroni correction). (DOCX)

**S9** Table. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin (body weight) exposures and liver cancer risk between male and females using a fully adjusted model\*. P-value of 0.01 was considered statistically significant (after Bonferroni correction). (DOCX)

S10 Table. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin exposures and intrahepatic biliary tract cancer risk using a fully adjusted model\*.

(DOCX)

S11 Table. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin exposures and extra-hepatic biliary tract cancer risk using a fully adjusted model\*.

(DOCX)

S12 Table. Hazard ratios (HR) and their 95% confidence intervals (CI) for the associations between mycotoxin exposures and gall bladder and biliary tract cancer risk using a fully adjusted model\*.

(DOCX)

**S13 Table.** Sources of mycotoxins: %contributions from the main EPIC food groups. (DOCX)

### Acknowledgments

We thank the National Institute for Public Health and the Environment (RIVM), Bilthoven, the Netherlands, for their contribution and ongoing support to the EPIC Study.

The coordination of EPIC is financially supported by International Agency for Research on Cancer (IARC) and by the Department of Epidemiology and Biostatistics, School of Public Health, Imperial College London which has additional infrastructure support provided by the NIHR Imperial Biomedical Research Centre (BRC).

The national cohorts are supported by: Danish Cancer Society (Denmark); Ligue Contre le Cancer, Institut Gustave Roussy, Mutuelle Générale de l'Education Nationale, Institut National de la Santé et de la Recherche Médicale (INSERM) (France); German Cancer Aid, German Cancer Research Center (DKFZ), German Institute of Human Nutrition Potsdam-Rehbruecke (DIfE), Federal Ministry of Education and Research (BMBF) (Germany); Associazione Italiana per la Ricerca sul Cancro-AIRC-Italy, Compagnia di SanPaolo and National Research Council (Italy); Dutch Ministry of Public Health, Welfare and Sports (VWS), the Netherlands Organisation for Health Research and Development (ZonMW), Netherlands Cancer Registry (NKR), LK Research Funds, Dutch Prevention Funds, Dutch ZON (Zorg Onderzoek Nederland), World Cancer Research Fund (WCRF), Statistics Netherlands (The Netherlands); Health Research Fund (FIS)—Instituto de Salud Carlos III (ISCIII), Regional Governments of Andalucía, Asturias, Basque Country, Murcia and Navarra, and the Catalan Institute of Oncology—ICO (Spain); Swedish Cancer Society, Swedish Research Council and County Councils of Skåne and Västerbotten (Sweden); Cancer Research UK (14136 to EPIC-Norfolk; C8221/A29017 to EPIC-Oxford), Medical Research Council (1000143 to EPIC-Norfolk; MR/M012190/1 to EPIC-Oxford). (United Kingdom).

# **Author Contributions**

Data curation: Corinne Casagrande.

Formal analysis: Carine Biessy.

Funding acquisition: Inge Huybrechts, Sarah De Saeger, Marthe De Boevre.

Writing - original draft: Inge Huybrechts.

Writing – review & editing: Inarie Jacobs, Elom K. Aglago, Mazda Jenab, Liesel Claeys, Jiri Zavadil, Genevieve Nicolas, Ghislaine Scelo, Andrea Altieri, Beatrice Fervers, Isabelle P. Oswald, Julien Vignard, Bernadette Chimera, Maria Santucci de Magistris, Giovanna Masala, Domenico Palli, Lisa Padroni, Jesús Castilla, Ana Jiménez-Zabala, Pauline Frenoy, Francesca Romana Mancini, Xuan Ren, Emily Sonestedt, Paolo Vineis, Alicia Heath, Mårten Werner, Esther Molina-Montes, Christina C. Dahm, Fie Langmann, José María Huerta, Magritt Brustad, Guri Skeie, Matthias B. Schulze, Antonio Agudo, Sabina Sieri, Michael Korenjak, Marc J. Gunter, Sarah De Saeger, Marthe De Boevre.

#### References

- Sharma R. Descriptive epidemiology of incidence and mortality of primary liver cancer in 185 countries: evidence from GLOBOCAN 2018. Jpn J Clin Oncol. 2020; 50:1370–9. <u>https://doi.org/10.1093/jjco/ hyaa130 PMID: 32719873</u>
- Sung H, Ferlay J, Siegel RL, Laversanne M, Soerjomataram I, Jemal A, et al. Global Cancer Statistics 2020: GLOBOCAN Estimates of Incidence and Mortality Worldwide for 36 Cancers in 185 Countries. CA: A Cancer Journal for Clinicians. 2021; 71:209–49. https://doi.org/10.3322/caac.21660 PMID: 33538338
- Balogh J, Victor D, 3rd, Asham EH, Burroughs SG, Boktour M, Saharia A, et al. Hepatocellular carcinoma: a review. J Hepatocell Carcinoma. 2016; 3:41–53. https://doi.org/10.2147/JHC.S61146 PMID: 27785449
- Smith MC, Madec S, Coton E, Hymery N. Natural Co-Occurrence of Mycotoxins in Foods and Feeds and Their in vitro Combined Toxicological Effects. Toxins (Basel). 2016; 8:94 <u>https://doi.org/10.3390/ toxins8040094</u> PMID: 27023609
- Serrano AB, Font G, Ruiz MJ, Ferrer E. Co-occurrence and risk assessment of mycotoxins in food and diet from Mediterranean area. Food Chem. 2012; 135:423–9. https://doi.org/10.1016/j.foodchem.2012. 03.064 PMID: 22868109
- De Boevre M, Jacxsens L, Lachat C, Eeckhout M, Di Mavungu JD, Audenaert K, et al. Human exposure to mycotoxins and their masked forms through cereal-based foods in Belgium. Toxicol Lett. 2013; 218:281–92. https://doi.org/10.1016/j.toxlet.2013.02.016 PMID: 23454655
- Lanier C, Richard E, Heutte N, Picquet R, Bouchart V, Garon D. Airborne molds and mycotoxins associated with handling of corn silage and oilseed cakes in agricultural environment. Atmospheric Environment. 2010; 44:1980–6.
- 8. Food AOotUN. The State of Food and Agriculture 1994. Rome, Italy 1994.
- 9. Dietary-related Exposure Assessments in the European Prospective Investigation into Cancer and Nutrition (EPIC) cohort: an integrated multi-tiered approach using the FoodEx2 classification system. In submission.

- Chawanthayatham S, Valentine CC, 3rd, Fedeles BI, Fox EJ, Loeb LA, Levine SS, et al. Mutational spectra of aflatoxin B(1) in vivo establish biomarkers of exposure for human hepatocellular carcinoma. Proc Natl Acad Sci U S A. 2017; 114:E3101–e9. https://doi.org/10.1073/pnas.1700759114 PMID: 28351974
- Zhang W, He H, Zang M, Wu Q, Zhao H, Lu LL, et al. Genetic Features of Aflatoxin-Associated Hepatocellular Carcinoma. Gastroenterology. 2017; 153:249–62.e2 <u>https://doi.org/10.1053/j.gastro.2017.03.</u> 024 PMID: 28363643
- Huang MN, Yu W, Teoh WW, Ardin M, Jusakul A, Ng AWT, et al. Genome-scale mutational signatures of aflatoxin in cells, mice, and human tumors. Genome Res. 2017; 27:1475–86. <u>https://doi.org/10.1101/</u> gr.220038.116 PMID: 28739859
- Humans IWGotEoCRt. Some traditional herbal medicines, some mycotoxins, naphthalene and styrene. IARC monographs on the evaluation of carcinogenic risks to humans. 2002; 82:1–556. PMID: 12687954
- Bensassi F, Gallerne C, Sharaf el Dein O, Hajlaoui MR, Lemaire C, Bacha H. In vitro investigation of toxicological interactions between the fusariotoxins deoxynivalenol and zearalenone. Toxicon. 2014; 84:1–6.
- Wang ZK, Yang YS, Stefka AT, Sun G, Peng LH. Review article: fungal microbiota and digestive diseases. Aliment Pharmacol Ther. 2014; 39:751–66. https://doi.org/10.1111/apt.12665 PMID: 24612332
- De Ruyck K, De Boevre M, Huybrechts I, De Saeger S. Dietary mycotoxins, co-exposure, and carcinogenesis in humans: Short review. Mutat Res Rev Mutat Res. 2015; 766:32–41. <u>https://doi.org/10.1016/j.mrrev.2015.07.003</u> PMID: 26596546
- Claeys L, Romano C, De Ruyck K, Wilson H, Fervers B, Korenjak M, et al. Mycotoxin exposure and human cancer risk: A systematic review of epidemiological studies. Compr Rev Food Sci Food Saf. 2020; 19:1449–64. https://doi.org/10.1111/1541-4337.12567 PMID: 33337079
- Wild CP, Montesano R. A model of interaction: aflatoxins and hepatitis viruses in liver cancer aetiology and prevention. Cancer Lett. 2009; 286:22–8. https://doi.org/10.1016/j.canlet.2009.02.053 PMID: 19345001
- Dong M, Tulayakul P, Li JY, Dong KS, Manabe N, Kumagai S. Metabolic conversion of zearalenone to alpha-zearalenol by goat tissues. J Vet Med Sci. 2010; 72(:307–12. <u>https://doi.org/10.1292/jvms.09-0122</u> PMID: 19959886
- 20. Bensassi F, El Golli-Bennour E, Abid-Essefi S, Bouaziz C, Hajlaoui MR, Bacha H. Pathway of deoxynivalenol-induced apoptosis in human colon carcinoma cells. Toxicology. 2009; 264:104–9. <u>https://doi.org/10.1016/j.tox.2009.07.020</u> PMID: 19664677
- Gursoy-Yuzugullu O, Yuzugullu H, Yilmaz M, Ozturk M. Aflatoxin genotoxicity is associated with a defective DNA damage response bypassing p53 activation. Liver Int. 2011; 31:561–71. <u>https://doi.org/ 10.1111/j.1478-3231.2011.02474.x PMID: 21382167</u>
- 22. Research WCRFAlfC. Diet, Nutrition, Physical Activity and Cancer: a Global Perspective. Continuous Update Project Expert Report 2018.: Available at dietandcancerreport.org; 2018
- Carlson DB, Williams DE, Spitsbergen JM, Ross PF, Bacon CW, Meredith FI, et al. Fumonisin B1 promotes aflatoxin B1 and N-methyl-N'-nitro-nitrosoguanidine-initiated liver tumors in rainbow trout. Toxicol Appl Pharmacol. 2001; 172:29–36. https://doi.org/10.1006/taap.2001.9129 PMID: 11264020
- Vandicke J, De Visschere K, Croubels S, De Saeger S, Audenaert K, Haesaert G. Mycotoxins in Flanders' Fields: Occurrence and Correlations with Fusarium Species in Whole-Plant Harvested Maize. Microorganisms. 2019; 7. https://doi.org/10.3390/microorganisms7110571 PMID: 31752071
- Battilani P, Toscano P, Van der Fels-Klerx HJ, Moretti A, Camardo Leggieri M, Brera C, et al. Aflatoxin B1 contamination in maize in Europe increases due to climate change. Sci Rep. 2016; 6:24328 <u>https://doi.org/10.1038/srep24328</u> PMID: 27066906
- Medina A, Rodriguez A, Magan N. Effect of climate change on Aspergillus flavus and aflatoxin B1 production. Front Microbiol. 2014; 5:348 https://doi.org/10.3389/fmicb.2014.00348 PMID: 25101060
- Miraglia M, Marvin HJ, Kleter GA, Battilani P, Brera C, Coni E, et al. Climate change and food safety: an emerging issue with special focus on Europe. Food Chem Toxicol. 2009; 47:1009–21. <u>https://doi.org/ 10.1016/j.fct.2009.02.005 PMID: 19353812</u>
- Riboli E, Hunt KJ, Slimani N, Ferrari P, Norat T, Fahey M, et al. European Prospective Investigation into Cancer and Nutrition (EPIC): study populations and data collection. Public Health Nutr. 2002; 5:1113– 24. https://doi.org/10.1079/PHN2002394 PMID: 12639222
- Huybrechts I, Rauber F, Nicolas G, Casagrande C, Kliemann N, Wedekind R, et al. Characterization of the degree of food processing in the European Prospective Investigation into Cancer and Nutrition: Application of the Nova classification and validation using selected biomarkers of food processing. Front Nutr. 2022; 9:1035580 https://doi.org/10.3389/fnut.2022.1035580 PMID: 36590209

- Slimani N, Deharveng G, Unwin I, Southgate DA, Vignat J, Skeie G, et al. The EPIC nutrient database project (ENDB): a first attempt to standardize nutrient databases across the 10 European countries participating in the EPIC study. Eur J Clin Nutr. 2007; 61:1037–56. https://doi.org/10.1038/sj.ejcn.1602679 PMID: 17375121
- **31.** World Health Organization. International classification of diseases for oncology (ICD-O). 3rd, 1st revision ed. Geneva: World Health Organization; 2013. Available from: https://www.who.int/standards/classifications/other-classifications/international-classification-of-diseases-for-oncology
- **32.** Benjamini Y, Hochberg Y. Controlling the false discovery rate: a practical and powerful approach to multiple testing. Journal of the Royal statistical society: series B (Methodological). 1995; 57:289–300.
- Authority EFS, Arcella D, Gómez Ruiz JÁ, Innocenti ML, Roldán R. Human and animal dietary exposure to ergot alkaloids. EFSA Journal. 2017; 15:e04902 https://doi.org/10.2903/j.efsa.2017.4902 PMID: 32625563
- Chain EPanel oCitF, Schrenk D, Bodin L, Chipman JK, del Mazo J, Grasl-Kraupp B, et al. Risk assessment of ochratoxin A in food. EFSA Journal. 2020; 18:e06113 https://doi.org/10.2903/j.efsa.2020.6113 PMID: 37649524
- Chain EPanel oCitF, Schrenk D, Bignami M, Bodin L, Chipman JK, del Mazo J, et al. Risk assessment of aflatoxins in food. EFSA Journal. 2020; 18:e06040 https://doi.org/10.2903/j.efsa.2020.6040 PMID: 32874256
- 36. GEMS / Food-EURO Second Workshop on Reliable Evaluation of Low-Level Contamination of Food Report on a Workshop in the Frame of GEMS / Food-EURO Kulmbach 1999. Available from: https:// www.semanticscholar.org/paper/GEMS-Food-EURO-Second-Workshop-on-Reliable-of-of-on/7d51 62794a407ce3361458649750a63b6bda3381
- 37. Chain EPanel oCitF, Knutsen HK, Alexander J, Barregård L, Bignami M, Brüschweiler B, et al. Risks to human and animal health related to the presence of deoxynivalenol and its acetylated and modified forms in food and feed. EFSA Journal. 2017; 15:e04718 <u>https://doi.org/10.2903/j.efsa.2017.4718</u> PMID: 32625635
- Chain EPoCitF. Scientific Opinion on the risks for animal and public health related to the presence of T-2 and HT-2 toxin in food and feed. EFSA Journal. 2011; 9:2481doi: https://doi.org/10.2903/j.efsa.2011.2481
- Chain EPoCitF. Scientific Opinion on risks for animal and public health related to the presence of nivalenol in food and feed. EFSA Journal. 2013; 11:3262 https://doi.org/10.2903/j.efsa.2013.3262
- 40. Chain EPanel oCitF, Knutsen H-K, Barregård L, Bignami M, Brüschweiler B, Ceccatelli S, et al. Appropriateness to set a group health-based guidance value for fumonisins and their modified forms. EFSA Journal. 2018; 16:e05172 https://doi.org/10.2903/j.efsa.2018.5172 PMID: 32625807
- Chain EPanel oCitF, Knutsen HK, Alexander J, Barregård L, Bignami M, Brüschweiler B, et al. Risk to human and animal health related to the presence of 4,15-diacetoxyscirpenol in food and feed. EFSA Journal. 2018; 16:e05367 https://doi.org/10.2903/j.efsa.2018.5367 PMID: 32626015
- Chain EPoCitF. Scientific Opinion on the risks for public health related to the presence of zearalenone in food. EFSA Journal. 2011; 9:2197 https://doi.org/10.2903/j.efsa.2011.2197
- Chain EPoCitF. Scientific Opinion on the risk for public and animal health related to the presence of sterigmatocystin in food and feed. EFSA Journal. 2013; 11:3254 https://doi.org/10.2903/j.efsa.2013.3254
- Rieswijk L, Claessen SM, Bekers O, van Herwijnen M, Theunissen DH, Jennen DG, et al. Aflatoxin B1 induces persistent epigenomic effects in primary human hepatocytes associated with hepatocellular carcinoma. Toxicology. 2016; 350:31–9. https://doi.org/10.1016/j.tox.2016.05.002 PMID: 27153756
- 45. Knutsen HK, Alexander J, Barregård L, Bignami M, Brüschweiler B, Ceccatelli S, et al. Risks to human and animal health related to the presence of deoxynivalenol and its acetylated and modified forms in food and feed. Efsa j. 2017; 15:e04718 https://doi.org/10.2903/j.efsa.2017.4718 PMID: 32625635
- Pestka JJ. Deoxynivalenol-induced proinflammatory gene expression: mechanisms and pathological sequelae. Toxins. 2010; 2:1300–17. https://doi.org/10.3390/toxins2061300 PMID: 22069639
- **47.** Payros D, Dobrindt U, Martin P, Secher T, Bracarense APF, Boury M, et al. The food contaminant deoxynivalenol exacerbates the genotoxicity of gut microbiota. MBio. 2017; 8: 00007–17 <u>https://doi.org/10.</u> 1128/mBio.00007-17 PMID: 28292979
- Pinton P, Oswald IP. Effect of deoxynivalenol and other Type B trichothecenes on the intestine: a review. Toxins. 2014; 6:1615–43. https://doi.org/10.3390/toxins6051615 PMID: 24859243
- Nielsen C, Lippke H, Didier A, Dietrich R, Märtlbauer E. Potential of deoxynivalenol to induce transcription factors in human hepatoma cells. Molecular nutrition & food research. 2009; 53:479–91. <u>https://doi.org/10.1002/mnfr.200800475</u> PMID: 19360757
- Hasuda AL, Person E, Khoshal AK, Bruel S, Puel S, Oswald IP, et al. Deoxynivalenol induces apoptosis and inflammation in the liver: Analysis using precision-cut liver slices. Food and Chemical Toxicology. 2022; 163:112930 https://doi.org/10.1016/j.fct.2022.112930 PMID: 35314294

- Tardivel C, Airault C, Djelloul M, Guillebaud F, Barbouche R, Troadec J-D, et al. The food born mycotoxin deoxynivalenol induces low-grade inflammation in mice in the absence of observed-adverse effects. Toxicology letters. 2015; 232:601–611. https://doi.org/10.1016/j.toxlet.2014.12.017 PMID: 25549547
- Bracarense A, Basso KM, Da Silva EO, Payros D, Oswald IP. Deoxynivalenol in the liver and lymphoid organs of rats: effects of dose and duration on immunohistological changes. World Mycotoxin Journal. 2017; 10:89–96.
- Bondy G, Coady L, Curran I, Caldwell D, Armstrong C, Aziz S, et al. Effects of chronic deoxynivalenol exposure on p53 heterozygous and p53 homozygous mice. Food and Chemical Toxicology. 2016; 96:24–34. https://doi.org/10.1016/j.fct.2016.07.018 PMID: 27456127
- Juan-García A, Juan C, König S, Ruiz M-J. Cytotoxic effects and degradation products of three mycotoxins: Alternariol, 3-acetyl-deoxynivalenol and 15-acetyl-deoxynivalenol in liver hepatocellular carcinoma cells. Toxicology letters. 2015; 235:8–16. https://doi.org/10.1016/j.toxlet.2015.03.003 PMID: 25772259
- 55. Alassane-Kpembi I, Kolf-Clauw M, Gauthier T, Abrami R, Abiola FA, Oswald IP, et al. New insights into mycotoxin mixtures: The toxicity of low doses of Type B trichothecenes on intestinal epithelial cells is synergistic. Toxicology and applied pharmacology. 2013; 272:191–198. https://doi.org/10.1016/j.taap. 2013.05.023 PMID: 23735874
- 56. Alassane-Kpembi I, Puel O, Pinton P, Cossalter A-M, Chou T-C, Oswald IP. Co-exposure to low doses of the food contaminants deoxynivalenol and nivalenol has a synergistic inflammatory effect on intestinal explants. Archives of toxicology. 2017; 91:2677–2687. https://doi.org/10.1007/s00204-016-1902-9 PMID: 27915442
- Garofalo M, Payros D, Oswald E, Nougayrède J-P, Oswald IP. The foodborne contaminant deoxynivalenol exacerbates DNA damage caused by a broad spectrum of genotoxic agents. Science of the total environment. 2022; 820:153280 https://doi.org/10.1016/j.scitotenv.2022.153280 PMID: 35066032
- Garofalo M, Payros D, Penary M, Oswald E, Nougayrède J-P, Oswald IP. A novel toxic effect of foodborne trichothecenes: The exacerbation of genotoxicity. Environmental Pollution. 2023; 317:120625 https://doi.org/10.1016/j.envpol.2022.120625 PMID: 36410598
- **59.** Willett W. Nutritional epidemiology. 3<sup>rd</sup> ed. Oxford university press; 2012.
- Vidal A, Claeys L, Mengelers M, Vanhoorne V, Vervaet C, Huybrechts B, et al. Humans significantly metabolize and excrete the mycotoxin deoxynivalenol and its modified form deoxynivalenol-3-glucoside within 24 hours. Scientific reports. 2018; 8:5255 <u>https://doi.org/10.1038/s41598-018-23526-9</u> PMID: 29588479
- De Ruyck K, Huybrechts I, Yang S, Arcella D, Claeys L, Abbeddou S, et al. Mycotoxin exposure assessments in a multi-center European validation study by 24-hour dietary recall and biological fluid sampling. Environment International. 2020; 137:105539 <u>https://doi.org/10.1016/j.envint.2020.105539</u> PMID: 32035364
- Hamad GM, Mehany T, Simal-Gandara J, Abou-Alella S, Esua OJ, Abdel-Wahhab MA, et al. A review of recent innovative strategies for controlling mycotoxins in foods. Food Control. 2023; 144:109350 https://doi.org/10.1016/j.foodcont.2022.109350