SCIENTIFIC REPORTS

Received: 14 May 2016 Accepted: 16 September 2016 Published: 19 October 2016

OPEN Comparative risk assessment of tobacco smoke constituents using the margin of exposure approach: the neglected contribution of nicotine

Claudia Baumung^{1,2}, Jürgen Rehm^{3,4,5,6,7,8}, Heike Franke^{1,9} & Dirk W. Lachenmeier^{2,3}

Nicotine was not included in previous efforts to identify the most important toxicants of tobacco smoke. A health risk assessment of nicotine for smokers of cigarettes was conducted using the margin of exposure (MOE) approach and results were compared to literature MOEs of various other tobacco toxicants. The MOE is defined as ratio between toxicological threshold (benchmark dose) and estimated human intake. Dose-response modelling of human and animal data was used to derive the benchmark dose. The MOE was calculated using probabilistic Monte Carlo simulations for daily cigarette smokers. Benchmark dose values ranged from 0.004 mg/kg bodyweight for symptoms of intoxication in children to 3 mg/kg bodyweight for mortality in animals; MOEs ranged from below 1 up to 7.6 indicating a considerable consumer risk. The dimension of the MOEs is similar to those of other tobacco toxicants with high concerns relating to adverse health effects such as acrolein or formaldehyde. Owing to the lack of toxicological data in particular relating to cancer, long term animal testing studies for nicotine are urgently necessary. There is immediate need of action concerning the risk of nicotine also with regard to electronic cigarettes and smokeless tobacco.

Tobacco smoking can cause numerous diseases such as cardiovascular disease, chronic obstructive pulmonary disease and various types of cancer including lung, oral, esophageal and bladder cancer¹. Tobacco smoking has been classified as "carcinogenic to humans" (group 1) by the International Agency for Research on Cancer². The World Health Organization (WHO) forecasts that cigarettes will kill nearly 10 million people per year globally by the year 2020², and the reduction of smoking is crucial to achieve the goals of the "Global Action Plan for Prevention and Control of Non-Communicable Diseases (NCDs)"3,4.

Tobacco smoke is a complex chemical mixture containing more than 5000 components^{2,5-10}. Classes of compounds include but are not limited to neutral gases, carbon and nitrogen oxides, amides, imides, lactames, carboxylic acids, lactones, esters, aldehydes, ketones, alcohols, phenols, amines, N-nitrosamines, N-heterocyclics, aliphatic hydrocarbons, monocyclic and polycyclic aromatic hydrocarbons, nitriles, anhydrides, carbohydrates, ethers, nitro compounds and metals^{2,7,8,11}. The available knowledge on the relationship between tobacco smoking and the development of cancer in humans is based primarily on epidemiological evidence. A large amount of such evidence has become available over the last decades². More than 70 carcinogens in tobacco smoke have been evaluated by the IARC monographs programme, and sixteen of these are classified as carcinogenic to humans

¹Postgraduate Study for "Toxicology and Environmental Protection", Institute for Legal Medicine, University of Leipzig, Leipzig, Germany. ²Chemisches und Veterinäruntersuchungsamt (CVUA) Karlsruhe, Karlsruhe, Germany. ³Epidemiological Research Unit, Technische Universität Dresden, Klinische Psychologie and Psychotherapie, Dresden, Germany. ⁴Social and Epidemiological Research (SER) Department, Centre for Addiction and Mental Health (CAMH), Toronto, Canada. ⁵Institute of Medical Sciences, University of Toronto (UofT), Toronto, Canada. ⁶Dalla Lana School of Public Health, UofT, Toronto, Canada. ⁷Dept. of Psychiatry, Faculty of Medicine, UofT, Toronto, Canada. ⁸PAHO/WHO Collaborating Centre for Mental Health and Addiction, Toronto, Canada. ⁹Rudolf Boehm Institut für Pharmakologie und Toxikologie, Medizinische Fakultät, Universität Leipzig, Leipzig, Germany. Correspondence and requests for materials should be addressed to D.W.L. (email: Lachenmeier@web.de)

into group 1². Nicotine was not among the evaluated substances. Although nicotine is most commonly not considered as being carcinogenic itself, the risk of long-term nicotine intake is more or less unknown and under researched¹². Some limited research shows that nicotine can stimulate the growth of lung cancer cells and may contribute to apoptosis¹². Nevertheless, nicotine is currently not considered as a tobacco smoke constituent that is recommended by WHO for lowering¹³.

In the past, several studies provided lists of hazardous compounds in tobacco smoke. The various lists differ in composition of focused toxicants. The most established list is the so-called Hoffmann-list from the 1990s, which only includes carcinogens⁵. Most risk assessment studies are based on this Hoffmann list. This may be the reason why nicotine has been neglected.

There is significant evidence, that nicotine is the primary psychoactive component of tobacco smoke. Nicotine dependence, as defined by the International Classification of Diseases (ICD), is a chronic brain disorder, resulting from the interaction of several factors, and includes physical, psychological and social characteristics (for reviews see: refs 14–16).

Nicotine addictive effects are mediated through the binding to nicotinic acetylcholine receptor (nAChR) subtypes expressed in the brain, particularly located on dopaminergic neurons in the ventral tegmental area and stimulating the release of dopamine in the shell of the nucleus accumbens, which is the important mechanism in drug-induced reward ("brain's reward system")^{17–19}. Additionally, changes in the dopamine level are supported by nicotine-induced release of other neurotransmitters, e.g. nicotine also augments glutamate release (which facilitates the release of dopamine) and γ -aminobutyric acid (GABA) release (which inhibits dopamine release) in these brain areas^{14,17,18}.

The increase in dopamine level in the reward system signals a pleasurable experience. The repeated association with smoking-perceived positive effects in combination with a long-lasting conditioning to additional triggering stimuli promotes further nicotine consumption^{16,20}. With long-term exposure to nicotine intake neuroadaptation (tolerance) develops, the existing nAChRs become less sensitive (desensitization/inactivation), which is accompanied by nicotine-induced upregulation of the receptor^{18,21}.

Nicotine is rapidly and extensively (more than 80%¹⁰) metabolized by the liver, primarily by the liver enzyme CYP2A6 (and to a lesser extent by CYP2B6 and CYP2E1) to cotinine²². Variability in rate of metabolism contributes to vulnerability to tobacco dependence, response to smoking cessation treatment, and lung cancer risk¹⁵.

One of the currently most preferred approaches for quantitative risk assessment is the margin of exposure (MOE). The margin of exposure (MOE) is the ratio between a defined point on the dose-response curve for the adverse effect and the human intake. A suitable point of reference from the dose-response curve is the lower confidence limit of the dose which causes a benchmark response of 10% (BMDL10). The magnitude of the risk is reciprocally proportional to the MOE. In general for carcinogens an MOE of 10,000 or higher would be of low concern from a public health point of view and might be considered as a low priority for risk management. The more the MOE falls below 10,000, the higher is the risk of the substance for the considered toxicological endpoint.

Cunningham *et al.*⁹ presented a risk assessment of numerous tobacco smoke toxicants based on the MOE approach. For this, available toxicological data from the literature was used to calculate the BMDL10 and finally the MOE for each component with the objective to segregate the toxicants. A similar study from Xie *et al.*²³ made a probabilistic risk assessment approach to prioritize the chemical constituents in mainstream smoke of cigarettes. For this purpose the MOE model was used as well. However both of the surveys did not include nicotine in the assessment.

Only a few previous studies researched the margin of exposure of nicotine but did not include the other tobacco toxicants. Lachenmeier and Rehm²⁴ conducted a comparative risk assessment of drugs including alcohol and tobacco, the MOE of nicotine in tobacco being in the high risk category. Hahn *et al.*²⁵ researched and assessed electronic cigarettes concerning chemical composition and exposure estimation based on the MOE approach. In this case, nicotine was the compound with the highest risk.

The intention of this study is therefore to provide a holistic comparative risk assessment of all tobacco and tobacco smoke components-for the first time including nicotine-using the MOE approach.

Results

A summary of toxicological thresholds for various effects of nicotine is shown in Table 1. Literature data was used to determine the BMDL values for each effect (See data appendix provided as Supplementary Material for raw results of benchmark dose-response modelling). The values of BMDL10 depend on the researched toxic effect and range from 0.004 mg/kg bodyweight (bw) for various symptoms of intoxication (human (children)) and 0.2 mg/kg bw for toxic effects in the liver (rats) up to 3 mg/kg bw for mortality (various animal species, probabilistic calculation based on data from bird, dog, mouse and rat, see Lachenmeier and Rehm²⁴ for details).

Based on the data from Cunningham *et al.*⁹, Xie *et al.*²³ and own data (Lachenmeier and Rehm²⁴), nicotine exposure from smoking cigarettes was calculated (Table 2).

As no information about the most likely function for intake distribution is available, a uniform probability distribution was entered into the calculation in this case (Supplementary Tables S1 and S2). The calculated mean values of daily nicotine intake range from 0.229 mg/kg bw/day up to 0.543 mg/kg bw/day.

The margins of exposure for tobacco smoke constituents including nicotine are given in Table 3. The MOEs of the smoke constituents (except nicotine) are extracted from Xie *et al.*²³ and Cunningham *et al.*⁹. For the toxicants that had several different MOEs tabulated for various endpoints, the lowest MOE was used in each case. Generally only toxicants with MOE below 10,000 were considered. The data for nicotine were calculated in this study based on the exposure data from Xie *et al.*²³ and Cunningham *et al.*⁹, as well as our own data. The lowest MOE values of smoke toxicants based on the methodology of Xie *et al.*²³ are in the range between 15 and 18 (hydrogen cyanide, 1,3-butadiene, acrolein). According to the methodology of Cunningham *et al.*⁹, the substances in tobacco smoke with the highest toxicological risks are acrolein, formaldehyde and cadmium compounds (mean MOE 1–8).

| Species | Effect | Type of endpoint | Value [mg/kg bw] | Reference |
|----------------------------------|----------------------------------|---------------------|--------------------|---|
| Humans, i.v., acute | Heart rate acceleration | LOAEL | 0.008 ^a | EFSA ²⁸ based on Lindgren et al. ²⁶ |
| Humans, i.v., acute | Heart rate acceleration | BMDL for BMR=1SD | 0.013 | Own modelling ^c based on data from Lindgren <i>et al.</i> ²⁶ |
| Humans, chronic cigarette use | Addiction | Threshold | 0.07 ^b | Benowitz and Henningfield ²⁹ |
| Humans (Children), dermal, acute | Various symptoms of intoxication | LOEL | 0.01 | EFSA ²⁸ based on Woolf et al. ³⁴ |
| Humans (Children), dermal, acute | Various symptoms of intoxication | BMDL10 | 0.004 | Own modelling ^c based on data from Woolf <i>et al.</i> ³⁴ |
| Various animal species, acute | Mortality (LD50 studies) | BMDL10 ^d | 3 | Lachenmeier and Rehm ²⁴ |
| Rats, 10-day study | Liver: fatty change | BMDL10 | 0.27 | Own modelling ^c based on data from Yuen <i>et al.</i> ¹⁰ |
| Rats, 10-day study | Liver: focal necrosis | BMDL10 | 0.24 | Own modelling ^c based on data from Yuen <i>et al.</i> ¹⁰ |
| Rats, 10-day study | Liver: dark cell change | BMDL10 | 0.21 | Own modelling ^c based on data from Yuen <i>et al.</i> ¹⁰ |
| Rats, 10-day study | Pathological changes in liver | NOAEL | 1.25 | US EPA ⁶¹ based on data from Yuen <i>et al.</i> ¹⁰ |

Table 1. Toxicological thresholds of nicotine. ^aBased on a LOAEL of 0.0035 mg/kg bw using a correction factor of 0.44 (extrapolation from the intravenous route to the oral route). For methodology see EFSA²⁸. ^bRecalculated from the threshold level of 5 mg/day²⁹ assuming an average bodyweight of 73.9 kg⁶². ^cSee data appendix provided as supplementary material for raw results of benchmark dose-response modelling. ^dThe BMDL10 was extrapolated from LD50 data in various animal studies in bird, dog, mouse and rat²⁴.

Nicotine indicates even a higher potential toxicological risk; for four different toxicological endpoints and species, the MOEs of nicotine were calculated as ranging from 0.04 up to 7.6 (Fig. 1). The full numerical results of the MOE distributions are presented in Supplementary Table S3.

For sensitivity analysis, convergence testing during the probabilistic simulation was conducted. Convergence was achieved for all calculated output MOE values. This means that the generated output distributions are stable and reliable. The estimated means change less than 5% as additional iterations are run during the simulation. From the model input variables, the highest influence (as expressed by rank of regression coefficients) on the results is caused by the number of cigarettes per day, with the bodyweight on second position, and only a minor influence of nicotine yield per cigarette.

Discussion

Some studies have performed a cumulative risk assessment on tobacco smoke toxicants by computing a total MOE. A total or cumulative MOE can be calculated by building the reciprocal of the sum of the reciprocals of the single MOEs. The implementation of this method was not possible in the current study because the toxicants have different target organs and effect mechanisms that makes it impossible to estimate a meaningful total MOE for tobacco toxicants.

This study allows comparing the potential toxicological risk of several tobacco smoke constituents especially in comparison with nicotine by using the MOE approach. For that purpose toxicity data of nicotine has been used to estimate the MOE and the results were compared to MOEs of various other tobacco toxicants from the literature. Due to the fact that adequate toxicity threshold data were unavailable for nicotine, BMDL values had to be calculated from literature dose-response data by own modelling. BMDL10 values of nicotine were derived for five toxicological endpoints (Table 1). For four of those endpoints the margins of exposure were calculated (Fig. 1). All four computed MOE distributions of nicotine are below 10 and may be interpreted as indicating a very high risk of this compound for tobacco smokers.

The MOE for the endpoint "heart rate acceleration" is based on data from Lindgren *et al.*²⁶ who investigated the effect of nicotine in humans after i.v. dosage. As this endpoint is the most sensitive effect, the MOE is the lowest (0.04). However, this may be an overestimation of the risk. The detected heart rate increase of approximately 7 beats/min was still within the normal range of intraday fluctuations²⁷ and is therefore not necessarily an adverse effect. The Lindgren *et al.*²⁶ data is also statistically questionable for dose-response assessment, because the standard deviations of the data points were not provided and had to be estimated (see data appendix). In addition, a discrepancy exists in the study regarding the exposure units. On the one hand, the unit of nicotine is specified in the unit ng/ml plasma. However identical numerical values are mentioned in the results section as being in the unit μ g/kg bw, which is not mathematically possible. The corresponding author was not able to clarify the discrepancy in the data (Lindgren 2015, personal communication). For these reasons, we believe that the MOE data based on Lindgren *et al.*²⁶ cannot be judged as reliable and should be carefully scrutinized prior to their use as the basis for risk management action. It must be mentioned that EFSA²⁸ judged Lindgren *et al.*²⁶ as a *pivotal* study, which was exclusively used as the basis for EFSA's risk assessment, the rationale probably being to provide the most conservative assessment.

The second considered effect was "addiction" in humans based on data from Benowitz and Henningfield²⁹. The derived average MOE is 0.2. This is clearly in the high risk range and biologically plausible as nicotine is known as the addictive principle in tobacco^{29,30}. Nevertheless, we are reluctant to use this value for risk assessment, as "addiction" is a rather vague concept which changed its definition remarkably often over the past 50 years, even if only medical classifications are considered³¹⁻³³.

| Study | Nicotine content per cigarette | Cigarette smoking per day | Bodyweight | Calculation method | Average daily nicotine intake (smokers) |
|------------------------------------|--|---|---|----------------------------|---|
| Cunningham et al.9 | Constituent yield from 1R4F cigarettes under the Health Canada Intense machine-smoke regime [note: the 1R4F reference cigarette contains 0.8 mg nicotine according to Calafat <i>et al.</i> ⁶³] | 20 cigarettes/day | 70 kg ⁶⁴ | Point estimate | 0.229 mg/kg bw/day ^a |
| Xie et al. ²³ | Analyses of 30 brands of cigarettes sold in China using the Canadian intense smoking regime $(2.09 \pm 0.25 \text{ mg nicotine/cigarette})$ | Data from the 2006 China Health and Nutrition survey (average 16.4 cigarettes/day, P5 3 cigarettes/day, P95 30 cigarettes/day) | Average 63.3 kg, P5 46.7 kg, P95 84.2 kg | Probabilistic ^b | 0.543 mg/kg bw/day ^c |
| Lachenmeier and Rehm ²⁴ | 1.65–1.89 mg nicotine/cigarette ⁴⁷ | 10-20 cigarettes/day ⁶⁵ | $73.9\pm12kg^{62}$ | Probabilistic ^b | 0.359 mg/kg bw/day |

Table 2. Data sources applied to calculate exposure for tobacco consumption-related toxicants and nicotine. ^aOwn calculation based on data from Cunningham *et al.*⁹. ^bSee Supplementary Tables S1 and S2 for distribution functions and calculation methodology. ^cOwn calculation based on data from Xie *et al.*²³.

.....

The other two endpoints rely on animal bioassays. For the effect "changes in rat liver" (fatty change, focal necrosis and dark cell change) an average MOE of about 0.61 was calculated based on data of Yuen *et al.*¹⁰. This calculation may, however, underestimate the risk of nicotine due to the very short duration of the liver toxicity study of only 10 days.

Finally, according to the severity of the toxicological endpoint, the average MOE of 7.6 for animal mortality is the highest (data based on several acute studies on various animal species summarized in Lachenmeier and Rehm²⁴).

For the toxicological endpoint "various symptoms of intoxication in children" based on data from Woolf *et al.*³⁴ the MOE was not calculated. The authors believe that this acute dermal exposure study in children is not applicable for risk assessment of habitual smoking, because of the different exposure conditions and questionable transferability to adults.

With a MOE from below 1 up to 7.6, the risk of nicotine is in the same dimension as the tobacco (smoke) toxicants with the lowest MOE such as acrolein, formaldehyde and cadmium compounds, which are the tobacco toxicants with the highest concerns relating to adverse health effects. There appears to be a fundamental problem that nicotine has never before been included in any risk assessment on tobacco or tobacco smoke toxicants. There are numerous studies about toxicological investigations from the tobacco industry and other authors available. Those studies tried to identify the most important toxicants from tobacco and to correlate them to the various diseases caused by cigarette smoking. However, nicotine has not been evaluated in any of them^{5,6,13,35,36}. Up to now nicotine has not been associated with carcinogenesis but the risk of long-term nicotine intake is more or less unknown and under-researched¹². The correlation of the disease risk to smoking dose, the mode of action and the etiology of the disease pathologies are not well understood³⁶. Pankow et al.³⁷ suggested that only about 4% of the observed risk for lung cancer can be explained by tobacco smoke toxicants. Also, in this case nicotine has not been part of the research. Could nicotine therefore explain a large part of the remaining risk? Currently there is only limited evidence to corroborate this hypothesis. Some experimental studies of different laboratories show that nicotine might promote or increase the risk of cancer^{1,12}. West et al.¹² demonstrated that it can stimulate the growth of lung cancer cells and may contribute to apoptosis. In alcohol, it had also been postulated for a long time, that ingredients other than ethanol were the main carcinogens, before ethanol itself was found as the main causal agent^{38,39}. The correlation between smoking cigarettes and cancer is well established². However, nicotine is so far considered as an addictive substance in tobacco smoke but not as a carcinogen. Bavarva et al.⁴⁰ investigated the genomic influence of nicotine and its genotoxic mechanism mediated through oxidative stress in a cell line experiment. The results indicate that nicotine exposure can adversely affect the human genome by inducing somatic mutations and may contribute to increased cancer incidence, characterizing nicotine as a carcinogen or mutagen.

In addition to the ones located in the brain, nicotine receptors are found throughout the body; for example, in muscle, endothelia, kidney and skin, in normal lung and in lung tumors. These receptors are involved in a number of cellular pathways of carcinogenesis. That provides some mechanistic plausibility to the hypothesis that nicotine may contribute to the carcinogenic process¹. But the studies have limitations in replicating human exposure and human evidence is clearly lacking so far. More research is needed to clarify if nicotine may make the major contribution to the mechanistically unexplained adverse effects. For example, there is no study on cancer endpoints currently available that would allow to calculate a MOE for this effect. We can only speculate if the pyrolysis products have been a misleading focus for research whereas the actual carcinogen has been neglected. Nicotine has previously not been evaluated by IARC but is on the current list of IARC to be re-evaluated with high priority⁴¹.

Our research showing that nicotine is among the top risk compounds in tobacco smoke leads to the question why there are no nicotine reduced cigarettes available on the market. Possibly the tobacco industry would lose clients if the nicotine exposures falls below the threshold of addiction^{42,43}. It is proven that nicotine-reduced cigarettes would be less addictive^{44,45}. For example, in a 10 week longitudinal study, the subjects at first smoked their usual brand followed by different types of research cigarettes with progressively lower nicotine content, each smoked for 1 week. After 4 weeks, 25% of the participants had spontaneously quit smoking⁴⁶. The results of a 6-week research show that nicotine-reduced cigarettes lower its exposure, dependence and the number of cigarettes smoked⁴⁵. These findings suggest that reducing the nicotine content of cigarettes could facilitate to quit smoking and therefore increase public health⁴⁵. In the USA nicotine reduced cigarettes is a topic of major concern

| Study | | Xie et al. ²³ | | | | Cunningham et al. ⁹ | |
|-----------------------------|---|--------------------------|--------------------|-------------------|---------------------|---|----------|
| Constituent ^a | Point of departure (species/endpoint) | MOE Mean | MOE P5 | MOE Median | MOE P95 | Point of departure (species/ endpoint) | MOE Mean |
| HCN | Human/Thyroid | 15 | 4 | 9 | 46 | not included in study | |
| 1,3-Butadiene | Human/Leukaemia | 18 | 4 | 10 | 52 | Mice/Alveolar/bronchiolar adenoma and carcinoma | 114 |
| Acrolein | Rat/Nasal lesions | 18 | 4 | 11 | 51 | Rats/Laryngeal-epithelial squamous metaplasia | 1 |
| Acrylonitrile | Rat/Nasal histopathology | 49 | 9 | 25 | 148 | Rat/Flattening of respiratory epithelium nasal turbinates | 42 |
| Isoprene | Mouse/Spleen hemangiosarcoma | 58 | 15 | 35 | 173 | Mice/Nasal turbinate olfactory epithelial degeneration | 325 |
| Formaldehyde | Rat/Nasal cancer | 102 | 21 | 59 | 307 | Rats/Nasal squamous metaplasia | 8 |
| Acetaldehyde | Rat/Nasal tumours | 166 | 42 | 100 | 490 | Rats/Nasal adenocarcinoma | 143 |
| Cadmium compounds | Human/Kidney | 196 | 23 | 65 | 499 | Rats/Any lung tumours | 6 |
| Catechol | Rat/Glandular stomach hyperplasia | 251 | 58 | 139 | 733 | not included in study | |
| Benzene | Human/Decreased lymphocyte count | 552 | 148 | 326 | 1596 | not included in study | |
| Chromium | Rat/Respiratory | 646 | 157 | 390 | 1941 | not included in study | |
| Ammonia | Rat/Respiratory | 1373 | 289 | 829 | 4201 | not included in study | |
| Arsenic | Human/Lung cancer | 1378 | 265 | 782 | 4283 | not included in study | |
| Quinoline | Rat/Liver tumours | 1528 | 373 | 920 | 4537 | not included in study | |
| Pyridine | Mouse/Liver tumours | 1552 | 391 | 936 | 4556 | not included in study | |
| Styrene | Human/CNS effects | 2644 | 645 | 1572 | 7765 | not included in study | |
| NNK | Rat/Lung Cancer | 3038 | 139 | 538 | 5857 | Rats/Lung tumours | 338 |
| m/p-Cresol | Mouse/Nasal lesions | 6735 | 1518 | 4023 | 20322 | Mice/Lung bronchial hyperplasia | 648 |
| Ethylene oxide | not included in study | | | | | Mice/Alveolar/bronchiolar carcinoma or adenoma | 2239 |
| NNN | Rat/Nasal cavity tumours | 263982 | 9554 | 37445 | 470255 | Rats/Nasal tumours | 3295 |
| The following data for nice | otine were calculated in this study based o | on the exposure data | from Xie <i>et</i> | al.23 and Cunning | ham <i>et al</i> .9 | | |
| Nicotine | Human/Heart rate acceleration (BMDL) | 0.03 | 0.01 | 0.02 | 0.06 | Human/Heart rate acceleration (BMDL) | 0.06 |
| Nicotine | Rats/Liver dark cell change | 0.44 | 0.18 | 0.37 | 0.93 | Rats/Liver dark cell change | 0.92 |
| Nicotine | Animals/Mortality | 5 | 1 | 4 | 13 | Animals/Mortality | 11 |

Table 3. Margin of exposure for tobacco smoke constituents summarized from the literature with comparison to own calculations for nicotine. The data from Xie *et al.*²³ and Cunningham *et al.*⁹ are reprinted with permission from Elsevier. ^aOnly constituents with MOE below 10,000 were included from the literature studies. For Cunningham *et al.*⁹ the lowest MOE was selected for the constituents that had several different MOEs tabulated for various endpoints. The literature data were rounded to the nearest whole number in cases when decimals were provided.

when accurate were provided

for research and policy since the commencement of an act in 2009⁴². Low-nicotine cigarettes have been and are on the US market⁴³. However, they have not been successfully marketed owing to the issue of how much nicotine may be removed without affecting the taste. The tobacco industry did extensive research to determine the threshold of targeting nicotine dosing by cigarettes⁴². Benowitz and Henningfield²⁹ derived a threshold level of nicotine in cigarettes from 5 mg or less to avert addiction. Instead Land *et al.*⁴⁷ concluded that the tobacco manufacturers even increased the nicotine yield over the years.

In contrast, some studies showed that smoking nicotine reduced cigarettes leads to more intensive smok-ing to compensate for the necessity of nicotine⁴⁸⁻⁵¹. For example, Ashton *et al.*⁴⁸ suggested that smokers may compensate for about two-thirds of the difference in standard yields when switched from medium-nicotine to high or low-nicotine brands. The results show evidence of both upward and downward self-titration of nicotine intakes by smokers. This was confirmed by Gable⁵² who concluded that smokers tend to titrate to approximately 1 mg per cigarette by varying number and duration of puffs. Henningfield⁴⁹ concluded that there are no health benefits on smoking cigarettes with lower (tar and) nicotine levels compared to "normal yields". Woodward and Tunstall-Pedoe⁵¹ believe that in the case of deeper inhalation more carcinogenic pyrolysis products would be absorbed and concluded that not cigarettes with the lowest nicotine yields but those with low tar, low carbon monoxide and high nicotine yields appears to be the "most safe" cigarette. In contrast, Frenk and Dar⁵³ do not confirm the "nicotine compensation hypothesis". They are of the opinion that if nicotine is addictive in the same sense that heroin is, smokers would rapidly increase their dose (like heroin-dependent users do) by smoking more cigarettes or increasing number of puffs or deeper inhalation of the puffs or switching to cigarettes with a higher nicotine yield. But smokers do not. They arrive rapidly at their preferred number of cigarettes per day and the number remains stable for years. The conclusion of Frenk and Dar⁵³ is that nicotine seems to be involved in a down-regulation mechanism but not in up-regulation. In fact light cigarettes may be smoked more intensely because of the sensory reward of their reduced tar and taste.



Figure 1. Margin of exposure for nicotine for daily smokers considering different toxicological endpoints (The box is determined by the 25th and 75th percentiles. The whiskers are determined by the 5th and 95th percentiles. 1st and 99th percentiles are marked by x, while minimum and maximum are marked with dash).

Another important aspect which needs to be considered is the fact that a high number of people use tobacco replacement or nicotine products over many years without getting cancer⁵⁴, for instance pharmaceutical nicotine products for nicotine replacement therapy (NRT). NRT products such as nasal sprays, gums, tablets, lozenges and transdermal patches are marketed for helping people who want to stop smoking. The intended use of NRT products is the application for a fixed period of time. Only few users really quit smoking after this recommended time of 8–12 weeks. A lot of people do not stop the application after weeks but use these products over years some of them in addition to smoking. The US FDA does not have any significant safety concerns if smokers use nicotine replacement products in combination with another product or if they do not stop smoking completely before beginning to use smoking cessation products. NRTs do not appear to have a meaningful potential for abuse or dependence⁵⁵. On the other hand, it may be difficult to monitor chronic risks such as cancer from over-the-counter products such as NRTs, and confounding to the co-consumption of NRT with smoked tobacco is difficult to exclude.

If we assume that nicotine alone or in the form of NRTs does not have any chronic effect, there could be more factors involved. One of those might be the type of nicotine exposure. The most precise difference in nicotine intake is the speed of effect. It takes only a few seconds for high doses of nicotine from a cigarette to reach the brain when inhaled. Medicinal products achieve lower levels over a period of minutes for products such as nasal spray or oral products and hours for transdermal patches^{22,56}. Another essential point seems to be the complex mixture of nicotine and the other tobacco smoke toxicants. This is the exact difference from conventional cigarettes to electronic cigarettes (e-cigarettes) and NRTs. In conventional cigarettes, tobacco leaves are burned and nicotine is transferred besides toxic compounds produced during the combustion of tobacco such as carbon monoxide and nitrosamines from the solid phase to the vapor phase. Because the harmful constituents of cigarette smoke are absent or significantly reduced in e-cigarette aerosols, smoking e-cigarettes is supposed to be less hazardous than smoking conventional cigarettes^{57,58}. Hence, it may be speculated that nicotine and another compound in tobacco smoke may have cumulative effects.

In conclusion, all MOEs of nicotine in this study are less than 10 and within the range of very high risk. Owing to the lack of toxicological data particularly relating to cancer³⁰, long term animal bioassay studies for nicotine are urgently necessary. In this context all kinds of possible nicotine exposures as well as certain co-exposures (tobacco smoke toxicants) and different nicotine concentrations related to a potential threshold of addiction need to be considered. The study from Lindgren *et al.*²⁶ needs to be replicated. There is immediate need of action concerning the risk assessment of nicotine.

Methods

Toxicity data on nicotine were obtained by a computer-assisted literature search. Searches were carried out in the following databases: PubMed, Toxnet and ChemIDplus (U.S. National Library of Medicine, Bethesda, MD), Web of Science (Thomson Scientific, Philadelphia, PA), and IPCS/INCHEM (International Programme on Chemical Safety/Chemical Safety Information from Intergovernmental Organizations, WHO, Geneva, Switzerland). We specifically aimed to identify clinical and epidemiological studies in humans and long-term animal studies that would be usable for dose-response modelling.

The methodology for quantitative risk assessment was based on a previous study for risk assessment of drugs²⁴. The MOE approach was used for the risk assessment^{59,60}. The MOE is defined as the ratio between the lower one-sided confidence limit of the BMD (BMDL) and estimated human intake of the same compound. If the BMDL as preferred toxicological threshold for MOE assessment is unavailable, no observed effect levels (NOEL),

no observed adverse effect levels (NOAEL) or lowest observed adverse effect levels (LOAEL) may be applied. The values were either taken from the literature search, or additionally BMD and BMDL values were calculated using the US EPA's BMDS 2.6 software (available at the US Environmental Protection Agency website: http://www.epa.gov/ncea/bmds/index.html). The human nicotine intake for smokers of cigarettes was based on literature data^{9,23,24}.

The MOE was then calculated using the software package @Risk for Excel Version 5.5.0 (Palisade Corporation, Ithaca, NY, USA). Monte Carlo simulations were performed with 10,000 iterations using Latin Hypercube sampling and Mersenne Twister random number generator. Convergence was tested with a tolerance of 5% and a confidence level of 95%. The distribution functions and detailed calculation methodology is specified in Supplementary Tables S1 and S2.

References

- U.S. Department of Health and Human Services. The Health Consequences of Smoking-50 Years of Progress: A Report of the Surgeon General (Department of Health and Human Services. Centers for Disease Control and Prevention. National Center for Chronic Disease Prevention and Health Promotion. Office on Smoking and Health, Atlanta, GA, 2014).
- IARC Working Group on the Evaluation of Carcinogenic Risks to Humans. Tobacco smoking. IARC Monogr. Eval. Carcinog. Risks Hum. 100E, 43–211 (2012).
- 3. WHO. Global Action Plan for the Prevention and Control of NCDs 2013–2020 (World Health Organization, Geneva, Switzerland, 2013).
- 4. Kontis, V. *et al.* Contribution of six risk factors to achieving the "25×25" NCD mortality reduction target. *Lancet* **384**, 427–437 (2014).
- 5. Talhout, R. et al. Hazardous compounds in tobacco smoke. Int. J. Environ. Res. Public Health 8, 613-628 (2011).
- Fowles, J. & Dybing, E. Application of toxicological risk assessment principles to the chemical constituents of cigarette smoke. *Tob. Control* 12, 424–430 (2003).
- 7. Simms, L. Quantitative risk assessment vs. the whole story? In 66th Tobacco Science Research Conference: Quantitative Risk Assessment: a Path Forward (eds. Gerardi, A., Robertson, R. & Zaitlin, D.) pp. 33–63 (Tobacco Science Research Council, New York, NY, 2012).
- Purkis, S. W. Issues, Paradigms and Paradoxes that Need to be Addressed by Both Manufacturers and Regulators in the Measurement and Interpretation of Cigarette Smoke Yields of Harmful and Potentially Harmful Constituents (HPHCs), In 67th Tobacco Science Research Conference: Quantitative Risk Assessment: a Path Forward, (eds. Gerardi, A., Steach, J. & Zaitlin, D.) pp. 3–58 (Tobacco Science Research Council, New York, NY, 2013).
- 9. Cunningham, F. H., Fiebelkorn, S., Johnson, M. & Meredith, C. A novel application of the Margin of Exposure approach: Segregation of tobacco smoke toxicants. *Food Chem. Toxicol.* **49**, 2921–2933 (2011).
- 10. Yuen, S. T. *et al.* The effect of nicotine and its interaction with carbon tetrachloride in the rat liver. *Pharmacol. Toxicol.* 77, 225–230 (1995).
- 11. Rodgman, A. Problems with the Tobacco Products Scientific Advisory Committee (TPSAC) list of harmful or potentially harmful tobacco and/or tobacco smoke components. *Beitr. Tabakforsch. Int.* 24, 258–276 (2011).
- 12. West, K. A. et al. Rapid Akt activation by nicotine and a tobacco carcinogen modulates the phenotype of normal human airway epithelial cells. J. Clin. Invest. 111, 81–90 (2003).
- WHO Study Group on Tobacco Product Regulation. Report on the Scientific Basis of Tobacco Product Regulation. WHO Technical Report Series, no. 951 (World Health Organization, Geneva, Switzerland, 2008).
- 14. Laviolette, S. R. & van der Kooy, D. The neurobiology of nicotine addiction: bridging the gap from molecules to behaviour. *Nat. Rev. Neurosci.* 5, 55–65 (2004).
- Benowitz, N. L. Pharmacology of nicotine: addiction, smoking-induced disease, and therapeutics. Annu. Rev. Pharmacol. Toxocol. 49, 57–71 (2009).
- 16. Viarisio, V. Nicotine as a Health Risk. Facts on Smoking (German Cancer Research Center, Heidelberg, Germany, 2015).
- 17. Benowitz, N. L. Nicotine addiction. N. Engl. J. Med. 362, 2295-2303 (2010).
- Govind, A. P., Vezina, P. & Green, W. N. Nicotine-induced upregulation of nicotinic receptors: underlying mechanisms and relevance to nicotine addiction. *Biochem. Pharmacol.* 78, 756–765 (2009).
- Balfour, D. J., Wright, A. E., Benwell, M. E. & Birrell, C. E. The putative role of extra-synaptic mesolimbic dopamine in the neurobiology of nicotine dependence. *Behav. Brain Res.* 113, 73–83 (2000).
- 20. Nestler, E. J. Is there a common molecular pathway for addiction? *Nat. Neurosci.* 8, 1445–1449 (2005).
- 21. Wang, H. & Sun, X. Desensitized nicotinic receptors in brain. Brain Res. Brain Res. Rev. 48, 420–437 (2005).
- 22. Hukkanen, J., Jacob, P. & Benowitz, N. L. Metabolism and disposition kinetics of nicotine. Pharmacol. Rev. 57, 79-115 (2005).
- 23. Xie, J. et al. A probabilistic risk assessment approach used to prioritize chemical constituents in mainstream smoke of cigarettes sold
- in China. *Regul. Toxicol. Pharmacol.* **62**, 355–362 (2012). 24. Lachenmeier, D. W. & Rehm, J. Comparative risk assessment of alcohol, tobacco, cannabis and other illicit drugs using the margin
- of exposure approach. *Sci. Rep.* **5**, 8126 (2015). 25. Hahn, J. *et al.* Electronic cigarettes: overview of chemical composition and exposure estimation. *Tob. Induc. Dis.* **12**, 23 (2014).
- Lindgren, M., Molander, L., Verbaan, C., Lunell, E. & Rosen, I. Electroencephalographic effects of intravenous nicotine-a doseresponse study. *Psychopharmacol. (Berl.)* 145, 342–350 (1999).
- O'Brien, I. A., O'Hare, P. & Corrall, R. J. Heart rate variability in healthy subjects: effect of age and the derivation of normal ranges for tests of autonomic function. Br. Heart J. 55, 348–354 (1986).
- 28. EFSA. Potential risks for public health due to the presence of nicotine in wild mushrooms. EFSA J. RN-286, 1-47 (2009).
- Benowitz, N. L. & Henningfield, J. E. Establishing a nicotine threshold for addiction. The implications for tobacco regulation. N. Engl. J. Med. 331, 123–125 (1994).
- Sanner, T. & Grimsrud, T. K. Nicotine: Carcinogenicity and Effects on Response to Cancer Treatment-A Review. Front. Oncol. 5, 196 (2015).
- Room, R. Alcohol and drug disorders in the International Classification of Diseases: a shifting kaleidoscope. Drug Alcohol Rev. 17, 305–317 (1998).
- 32. Rehm, J. et al. Defining substance use disorders: do we really need more than heavy use? Alcohol Alcohol. 48, 633-640 (2013).
- 33. Anderson, P. et al. The new governance of addictive substances and behaviours (Oxford University Press, Oxford, 2016).
- Woolf, A., Burkhart, K., Caraccio, T. & Litovitz, T. Childhood poisoning involving transdermal nicotine patches. *Pediatrics* 99, E4 (1997).
- Piade, J. J., Wajrock, S., Jaccard, G. & Janeke, G. Formation of mainstream cigarette smoke constituents prioritized by the World Health Organization-yield patterns observed in market surveys, clustering and inverse correlations. *Food Chem. Toxicol.* 55, 329–347 (2013).

- Haussmann, H. J. Use of hazard indices for a theoretical evaluation of cigarette smoke composition. Chem. Res. Toxicol. 25, 794–810 (2012).
- Pankow, J. F., Watanabe, K. H., Toccalino, P. L., Luo, W. & Austin, D. F. Calculated cancer risks for conventional and "potentially reduced exposure product" cigarettes. *Cancer Epidemiol. Biomarkers Prev.* 16, 584–592 (2007).
- IARC Working Group on the Evaluation of Carcinogenic Risks to Humans. Alcohol consumption and ethyl carbamate. IARC Monogr. Eval. Carcinog. Risks Hum. 96, 1–1428 (2010).
- Lachenmeier, D. W., Przybylski, M. C. & Rehm, J. Comparative risk assessment of carcinogens in alcoholic beverages using the margin of exposure approach. Int. J. Cancer 131, E995–E1003 (2012).
- Bavarva, J. H., Tae, H., McIver, L. & Garner, H. R. Nicotine and oxidative stress induced exomic variations are concordant and overrepresented in cancer-associated genes. Oncotarget 5, 4788–4798 (2014).
- 41. Straif, K. et al. Future priorities for the IARC Monographs. The Lancet Oncology 15, 683-684 (2014).
- 42. Hatsukami, D. K. et al. Nicotine reduction revisited: science and future directions. Tob. Control 19, e1-10 (2010).
- Kozlowski, L. T. Prospects for a nicotine-reduction strategy in the cigarette endgame: Alternative tobacco harm reduction scenarios. Int. J. Drug Policy 26, 543–547 (2015).
- 44. Benowitz, N. L. & Henningfield, J. E. Reducing the nicotine content to make cigarettes less addictive. *Tob. Control* 22 Suppl 1, i14–i17 (2013).
- 45. Donny, E. C. et al. Randomized Trial of Reduced-Nicotine Standards for Cigarettes. N. Engl. J. Med. 373, 1340–1349 (2015).
- Benowitz, N. L. et al. Nicotine and carcinogen exposure with smoking of progressively reduced nicotine content cigarette. Cancer Epidemiol. Biomarkers Prev. 16, 2479–2485 (2007).
- 47. Land, T. *et al.* Recent increases in efficiency in cigarette nicotine delivery: Implications for tobacco control. *Nicotine Tob. Res.* 16, 753–758 (2014).
- 48. Ashton, H., Stepney, R. & Thompson, J. W. Self-titration by cigarette smokers. Br. Med. J. 2, 357–360 (1979).
- 49. Henningfield, J. E. Pharmacologic basis and treatment of cigarette smoking. J. Clin. Psychiatry 45, 24-34 (1984).
- 50. Revell, A. D. Smoking and performance-a puff-by-puff analysis. *Psychopharmacol.* (Berl.) 96, 563-565 (1988).
- Woodward, M. & Tunstall-Pedoe, H. Self-titration of nicotine: evidence from the Scottish Heart Health Study. Addiction 88, 821–830 (1993).
- 52. Gable, R. S. Toward a comparative overview of dependence potential and acute toxicity of psychoactive substances used nonmedically. *Am. J. Drug Alcohol Abuse* **19**, 263–281 (1993).
- 53. Frenk, H. & Dar, R. A critique of nicotine addiction, 2 ed. (Springer Science & Business Media, New York, 2000).
- US FDA. FDA 101: Smoking Cessation Products. FDA Consumer Health Information (U.S. Food and Drug Administration, Silver Spring, MD, 2015).
- 55. US FDA. Nicotine Replacement Therapy Labels May Change. FDA Consumer Health Information (U.S. Food and Drug Administration, Silver Spring, MD, 2013).
- 56. Molyneux, A. Nicotine replacement therapy. BMJ 328, 454 (2004).
- Bhatnagar, A. E-Cigarettes and Cardiovascular Disease Risk: Evaluation of Evidence, Policy Implications, and Recommendations. Curr. Cardiovasc. Risk Rep. 10, 1–10 (2016).
- England, L. J., Bunnell, R. E., Pechacek, T. F., Tong, V. T. & McAfee, T. A. Nicotine and the Developing Human: A Neglected Element in the Electronic Cigarette Debate. Am. J. Prev. Med. 49, 286–293 (2015).
- EFSA. Opinion of the Scientific Committee on a request from EFSA related to a harmonised approach for risk assessment of substances which are both genotoxic and carcinogenic. EFSA J. 282, 1–31 (2005).
- 60. US EPA. The use of the benchmark dose approach in health risk assessment. EPA/630/R-94/007 (Office of Research and Development. US Environmental Protection Agency, Washington, DC, 1995).
- 61. US EPA. Reregistration eligibility decision for nicotine (US Environmental Protection Agency, Washington, DC, 2008).
- EFSA Scientific Committee. Guidance on selected default values to be used by the EFSA Scientific Committee, Scientific Panels and Units in the absence of actual measured data. EFSA J. 10, 2579 (2012).
- 63. Calafat, A. M. *et al.* Determination of tar, nicotine, and carbon monoxide yields in the mainstream smoke of selected international cigarettes. *Tob. Control* **13**, 45–51 (2004).
- Dourson, M. L., Hertzberg, R. C., Hartung, R. & Blackburn, K. Novel methods for the estimation of acceptable daily intake. *Toxicol. Ind. Health* 1, 23–33 (1985).
- 65. OECD. OECD.Stat Extracts. Non-Medical Determinants of Health. MetaData. Tobacco consumption. http://stats.oecd.org/index. aspx?queryid=30127, 2014).

Acknowledgements

This publication was done within the Postgraduate Study for "Toxicology and Environmental Protection" at the University of Leipzig, Germany. The research leading to these results or outcomes has received funding from the European Community's Seventh Framework Programme (FP7/2007–2013), under Grant Agreement no. 266813-Addictions and Lifestyle in Contemporary Europe–Reframing Addictions Project (ALICE RAP–www. alicerap.eu). Participant organisations in ALICE RAP can be seen at http://www.alicerap.eu/about-alice-rap/partner-institutions.html. The views expressed here reflect only the authors' and the European Union is not liable for any use that may be made of the information contained therein. Support to CAMH for the salaries of scientists and infrastructure has been provided by the Ontario Ministry of Health and Long Term Care. The contents of this paper are solely the responsibility of the authors and do not necessarily represent the official views of the Ministry of Health and Long Term Care or of other funders. The European Commission's OPENAIRE FP7 post-grant open access publication fees.

Author Contributions

C.B. and D.W.L. conceived of the study, conceptualized the data analyses and performed the calculations. C.B. provided the first draft of the paper. J.R. contributed aspects of tobacco health and policy science to introduction and discussion. H.F. contributed aspects of nicotine neurobiology to introduction and discussion. D.W.L., J.R. and H.F. revised the first draft. All authors have been involved in the interpretation of the data and in critical revisions of the content. All authors have given final approval of the version to be published.

Additional Information

Supplementary information accompanies this paper at http://www.nature.com/srep

Competing financial interests: The authors declare no competing financial interests.

How to cite this article: Baumung, C. *et al.* Comparative risk assessment of tobacco smoke constituents using the margin of exposure approach: the neglected contribution of nicotine. *Sci. Rep.* **6**, 35577; doi: 10.1038/ srep35577 (2016).

This work is licensed under a Creative Commons Attribution 4.0 International License. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in the credit line; if the material is not included under the Creative Commons license, users will need to obtain permission from the license holder to reproduce the material. To view a copy of this license, visit http://creativecommons.org/licenses/by/4.0/

© The Author(s) 2016

Supplementary Tables S1-S3, Data appendix

Comparative risk assessment of tobacco smoke constituents using the margin of exposure approach: the neglected contribution of nicotine

Baumung, Claudia^{1,2}; Rehm, Jürgen³⁻⁸; Franke, Heike^{1,9}; Lachenmeier, Dirk W.^{2,3*}

¹Postgraduate Study for "Toxicology and Environmental Protection", Institute for Legal Medicine, University of Leipzig, Leipzig, Germany,

²Chemisches und Veterinäruntersuchungsamt (CVUA) Karlsruhe, Karlsruhe, Germany,

³Epidemiological Research Unit, Technische Universität Dresden, Klinische Psychologie and Psychotherapie, Dresden, Germany,

⁴Social and Epidemiological Research (SER) Department, Centre for Addiction and Mental Health (CAMH), Toronto, Canada,

⁵Institute of Medical Sciences, University of Toronto (UofT), Toronto, Canada,

⁶Dalla Lana School of Public Health, UofT, Toronto, Canada,

⁷Dept. of Psychiatry, Faculty of Medicine, UofT, Toronto, Canada,

⁸PAHO/WHO Collaborating Centre for Mental Health and Addiction, Toronto, Canada,

⁹Rudolf Boehm Institut für Pharmakologie und Toxikologie, Medizinische Fakultät, Universität Leipzig, Leipzig, Germany

* Correspondence and requests for materials should be addressed to

D.W.L. (Lachenmeier@web.de)

| Parameter | Risk function ^a | Unit |
|---|---|--------------|
| Bodyweight for analysis according to Lachenmeier and Rehm (2015) | RiskNormal(73.9;12) | kg |
| Bodyweight for analysis in comparison to Xie et al. (2012) | RiskNormalAlt("mu";63.3;95%;84.2) | kg |
| Bodyweight for analysis in comparison to Cunningham et al. (2011) | 70 ^b | kg |
| Cigarettes per day for analysis according to Lachenmeier and Rehm (2015) | RiskUniform(10;20) | - |
| Cigarettes per day for analysis in comparison to Xie et al. (2012) | RiskNormalAlt("mu";16.4;95%;30;RiskTruncate(5;40)) | - |
| Cigarettes per day for analysis in comparison to Cunningham et al. (2011) | 20 ^b | - |
| Nicotine yield per cigarette for analysis according to Lachenmeier and Rehm (2015) | RiskUniform(1.65;1.89) | mg |
| Nicotine yield per cigarette for analysis in comparison to Xie et al. (2012) | RiskBetaGeneral(1.2144;1.4006;1.64582;2.61184;RiskTruncate(0;)) | mg |
| Nicotine yield per cigarette for analysis in comparison to Cunningham et al. (2011) | 0.8 ^b | mg |
| BMDL(Human heart rate) | 0.013 ^b | mg/kg bw/day |
| BMDL(Human addiction) | 0.07 ^b | mg/kg bw/day |
| BMDL(Rat Liver changes) | 0.21 ^b | mg/kg bw/day |
| BMDL(Animal mortality) according to Lachenmeier and Rehm (2015) | RiskNormal(2;1.8;RiskTruncate(0.92;5) | mg/kg bw/day |

Supplementary Table S1. Distribution functions as input for probabilistic analysis

^a RiskNormal(mean;standard deviation) specifies a normal distribution with the entered mean and standard deviation. RiskNormalAlt(arg1type, arg1value, arg2type,arg2value) specifies a normal distribution with two arguments of the type arg1type and arg2type. These arguments can be either a percentile between 0 and 1 or mu or sigma. RiskUniform(minimum;maximum) specifies a uniform probability distribution with the entered minimum and maximum values. Every value across the range has an equal likelihood of occurrence ("no knowledge" distribution). RiskTruncate(minimum;maximum) truncates the input distribution. Truncating distribution restricts samples drawn from the distribution to values within the entered minimum maximum range. RiskBetaGeneral(alpha1,alpha2,minimum,maximum) specifies a beta distribution with the defined minimum and maximum using the shape parameters alpha1 and alpha2.

Supplementary Table S2. Detailed calculation methodology for probabilistic risk assessment of nicotine due to tobacco smoking

| Parameter | Calculation formula for the software package @Risk for Excel Version 5.5.0 (Palisade, Corporation, Ithaca, NY, USA) ^a | Unit |
|---|--|--------------|
| Nicotine intake per day | = Risk function for cigarettes per day * Risk function for Nicotine yield per cigarette | mg/day |
| Nicotine intake per kg bodyweight per day | = Nicotine intake per day / Risk function for bodyweight | mg/kg bw/day |
| MOE | = Risk function for BMDL / Nicotine intake per kg bodyweight per day | - |

Supplementary Table S3. Raw results of probabilistic estimation of nicotine intakes and margin of exposure (MOE) using 10,000 iterations

| Parameter / Reference for calculation method | Minimum | Maximum | Mean | Std Deviation | 5% Perc | 25% Perc | 50% Perc | 75% Perc | 90% Perc | 95% Perc |
|---|---------|---------|-------|---------------|---------|----------|----------|----------|----------|----------|
| Nicotine intake mg per day (Lachenmeier and Rehm 2015) | 17 | 38 | 27 | 5 | 19 | 22 | 26 | 31 | 34 | 35 |
| Nicotine intake mg per day (Xie et al. 2012) | 8 | 99 | 37 | 16 | 15 | 25 | 36 | 47 | 58 | 65 |
| Nicotine intake mg per day (Cunningham <i>et al.</i> 2011) | - | - | 16 | - | - | - | - | - | - | - |
| Nicotine intake mg per kg bodyweight per day (Lachenmeier and Rehm 2015) | 0.16 | 1.10 | 0.37 | 0.10 | 0.23 | 0.30 | 0.36 | 0.43 | 0.50 | 0.54 |
| Nicotine intake mg per kg bodyweight per day (Xie <i>et al.</i> 2012) | 0.11 | 15.87 | 0.61 | 0.33 | 0.23 | 0.40 | 0.57 | 0.77 | 1.00 | 1.15 |
| Nicotine intake mg per kg bodyweight per day (Cunningham <i>et al.</i> 2011) | - | - | 0.23 | - | - | - | - | - | - | - |
| MOE for human heart rate (Lachenmeier and Rehm 2015) | 0.01 | 0.08 | 0.04 | 0.01 | 0.02 | 0.03 | 0.04 | 0.04 | 0.05 | 0.06 |
| MOE for human heart rate (Xie <i>et al.</i> 2012) | 0.00 | 0.12 | 0.03 | 0.02 | 0.01 | 0.02 | 0.02 | 0.03 | 0.05 | 0.06 |
| MOE for human heart rate (Cunningham <i>et al.</i> 2011) | - | - | 0.06 | - | - | - | - | - | - | - |
| MOE for human addiction (Lachenmeier and Rehm 2015) | 0.06 | 0.45 | 0.20 | 0.05 | 0.13 | 0.16 | 0.20 | 0.24 | 0.28 | 0.30 |
| MOE for human addiction (Xie et al. 2012) | 0.00 | 0.65 | 0.15 | 0.08 | 0.06 | 0.09 | 0.12 | 0.18 | 0.26 | 0.31 |
| MOE for human addiction (Cunningham <i>et al.</i> 2011) | - | - | 0.31 | - | - | - | - | - | - | - |
| MOE for rat Liver changes (Lachenmeier and Rehm 2015) | 0.19 | 1.35 | 0.61 | 0.16 | 0.39 | 0.49 | 0.59 | 0.71 | 0.83 | 0.90 |
| MOE for rat Liver changes (Xie <i>et al.</i> 2012) | 0.01 | 1.95 | 0.44 | 0.24 | 0.18 | 0.27 | 0.37 | 0.53 | 0.77 | 0.93 |
| MOE for rat Liver changes (Cunningham <i>et al.</i> 2011) | - | - | 0.92 | - | - | - | - | - | - | - |
| MOE for animal mortality (Lachenmeier and Rehm 2015) | 1.17 | 27.86 | 7.60 | 3.76 | 2.83 | 4.71 | 6.89 | 9.76 | 12.78 | 14.72 |
| MOE for animal mortality (Xie <i>et al.</i> 2012) | 0.15 | 41.13 | 5.48 | 4.02 | 1.46 | 2.79 | 4.40 | 6.83 | 10.43 | 13.24 |
| MOE for animal mortality (Cunningham <i>et al.</i> 2011) | 4.03 | 21.87 | 11.47 | 4.60 | 4.80 | 7.63 | 11.02 | 14.90 | 18.18 | 19.73 |

Data appendix with raw result for benchmark dose-response modelling

1. BMD Modelling for heart rate acceleration with data from Lindgren at al. (1999): raw data from Figure 1, right panel. Maximum beats/min values assumed to be 63/66/67/73/78 for the dose groups $0/3.5/7/14/28 \mu g/kg$ bw. Standard deviation not provided and estimated as 10 beats/min according to Moser *et al.* (1994) Circulation 90:1078-82.



Power Model, with BMR of 1 Std. Dev. for the BMD and 0.95 Lower Confidence Limit for the BMDL

The form of the response function is:

Y[dose] = control + slope * dose^power

```
Dependent variable = Max_beats_per_min
Independent variable = Dose
rho is set to 0
The power is restricted to be greater than or equal to 1
A constant variance model is fit
```

Total number of dose groups = 5 Total number of records with missing values = 0 Maximum number of iterations = 500 Relative Function Convergence has been set to: 1e-008 Parameter Convergence has been set to: 1e-008

```
Default Initial Parameter Values

alpha = 100

rho = 0 Specified

control = 63

slope = 290.43

power = -9999
```

Asymptotic Correlation Matrix of Parameter Estimates

(*** The model parameter(s) -rho -power have been estimated at a boundary point, or have been specified by the user, and do not appear in the correlation matrix)

| slop | control | alpha | |
|----------|-----------|-----------|---------|
| -8.1e-00 | -8.1e-009 | 1 | alpha |
| -0.7 | 1 | -8.1e-009 | control |
| | -0.73 | -8.1e-009 | slope |

Parameter Estimates

| | | | 95.0% Wald Confidence | | |
|-------------|----------|-----------|-----------------------|-------|--|
| Interval | | | | | |
| Variable | Estimate | Std. Err. | Lower Conf. Limit | Upper | |
| Conf. Limit | | | | | |
| alpha | 93.7721 | 15.8504 | 62.706 | | |
| 124.838 | | | | | |
| control | 63.775 | 1.6872 | 60.4681 | | |
| 67.0819 | | | | | |
| slope | 535.714 | 116.916 | 306.563 | | |
| 764.866 | | | | | |
| power | 1 | NA | | | |

NA - Indicates that this parameter has hit a bound implied by some inequality constraint and thus has no standard error.

Table of Data and Estimated Values of Interest

| Dose | Ν | Obs Mean | Est Mean | Obs Std Dev | Est Std Dev | Scaled Res. |
|--------|----|----------|----------|-------------|-------------|-------------|
| | | | | | | |
| 0 | 14 | 63 | 63.8 | 10 | 9.68 | -0.299 |
| 0.0035 | 14 | 66 | 65.6 | 10 | 9.68 | 0.135 |
| 0.007 | 14 | 67 | 67.5 | 10 | 9.68 | -0.203 |
| 0.014 | 14 | 73 | 71.3 | 10 | 9.68 | 0.667 |
| 0.028 | 14 | 78 | 78.8 | 10 | 9.68 | -0.299 |

Model Descriptions for likelihoods calculated

Model A1: Yij = Mu(i) + e(ij) Var{e(ij)} = Sigma^2

Model A2: Yij = Mu(i) + e(ij)
Var{e(ij)} = Sigma(i)^2

Model R: Yi = Mu + e(i) Var{e(i)} = Sigma^2

Likelihoods of Interest

| Model | Log(likelihood) | # Param's | AIC |
|--------|-----------------|-----------|------------|
| A1 | -193.587177 | 6 | 399.174355 |
| A2 | -193.587177 | 10 | 407.174355 |
| A3 | -193.587177 | 6 | 399.174355 |
| fitted | -193.930374 | 3 | 393.860748 |
| R | -203.111216 | 2 | 410.222432 |

Explanation of Tests

Test 1: Do responses and/or variances differ among Dose levels? (A2 vs. R) Test 2: Are Variances Homogeneous? (A1 vs A2) Test 3: Are variances adequately modeled? (A2 vs. A3) Test 4: Does the Model for the Mean Fit? (A3 vs. fitted) (Note: When rho=0 the results of Test 3 and Test 2 will be the same.)

Tests of Interest

| | -2*log(Likelihood Ratio) | Test df | p-value |
|---|--------------------------|---|---|
| 1 | 19.0481 | 8 | 0.0146 |
| 2 | 5.68434e-014 | 4 | 1 |
| 3 | 5.68434e-014 | 4 | 1 |
| 4 | 0.686393 | 3 | 0.8764 |
| | 1 2 3 4 | -2*log(Likelihood Ratio) 1 19.0481 2 5.68434e-014 3 5.68434e-014 4 0.686393 | -2*log(Likelihood Ratio) Test df 1 19.0481 8 2 5.68434e-014 4 3 5.68434e-014 4 4 0.686393 3 |

The p-value for Test 1 is less than .05. There appears to be a

difference between response and/or variances among the dose levels It seems appropriate to model the data

The p-value for Test 2 is greater than .1. A homogeneous variance model appears to be appropriate here

The p-value for Test 3 is greater than .1. The modeled variance appears to be appropriate here

The p-value for Test 4 is greater than .1. The model chosen seems to adequately describe the data $% \left(\frac{1}{2} \right) = 0$

Benchmark Dose Computation

Specified effect = 1

Risk Type = Estimated standard deviations from the control mean

Confidence level = 0.95

BMD = 0.0180761

BMDL = 0.0130478

2. BMD-Modelling with data from Woolf *et al.* (1997): raw data from Table 4. Upper bound set as dose level (i.e. 0.01, 0.099 and 0.5 mg/kg bw).



Multistage Cancer Model, with BMR of 10% Extra Risk for the BMD and 0.95 Lower Confidence Limit for the BMDL

```
Total number of observations = 3
       Total number of records with missing values = 0
       Total number of parameters in model = 3
Total number of specified parameters = 0
       Degree of polynomial = 2
       Maximum number of iterations = 500
       Relative Function Convergence has been set to: 1e-008
       Parameter Convergence has been set to: 1e-008
                       Default Initial Parameter Values
                          Background = 0
                             Beta(1) = 0
Beta(2) = 4.07602e+020
                 Asymptotic Correlation Matrix of Parameter Estimates
                 ( *** The model parameter(s) -Beta(1)
                      have been estimated at a boundary point, or have been
specified by the user,
                      and do not appear in the correlation matrix )
                   Background
                                 Beta(2)
      Background
                       1
                                   -0.33
         Beta(2)
                      -0.33
                                      1
                                      Parameter Estimates
                                                            95.0% Wald
Confidence Interval
             Variable
                           Estimate
                                           Std. Err. Lower Conf. Limit
Upper Conf. Limit
                            0.287085
                                            0.172829
                                                              -0.0516538
           Background
0.625824
                                   0
              Beta(1)
                                                  NA
             Beta(2)
                             36.5969
                                             73.4008
                                                                -107.266
180.46
      NA - Indicates that this parameter has hit a bound
           implied by some inequality constraint and thus
           has no standard error.
                             Analysis of Deviance Table
            Model
                       Log(likelihood) # Param's Deviance Test d.f. P-
value
          Full model
                            -5.60136
                                            3
                            -5.60168
                                           2 0.000640384 1
        Fitted model
0.9798
```

| | Reduced | model | -8. | 96765 | 1 | 6.73259 | 2 |
|---------|---------|-------|-----|-------|---|---------|---|
| 0.03452 | | | | | | | |

| | | Goodness of Fit | | | | | | |
|---|--------|-----------------|----------|----------|-------|--------------------|--|--|
| | Dose | EstProb. | Expected | Observed | Size | Scaled Residual | | |
| _ | | | | | | | | |
| | 0.5000 | 0.9999 | 4.000 | 4.000 | 4.000 | 0.017 | | |
| | 0.0990 | 0.5020 | 1.004 | 1.000 | 2.000 | -0.006 | | |
| | 0.0100 | 0.2897 | 2.028 | 2.030 | 7.000 | 0.002 | | |
| | | | | | | | | |

Chi^2 = 0.00 d.f. = 1 P-value = 0.9853

Benchmark Dose Computation

| Specified effect | = | 0.1 |
|------------------|---|------------|
| Risk Type | = | Extra risk |
| Confidence level | = | 0.95 |
| BMD | = | 0.0536558 |
| BMDL | = | 0.00399136 |
| BMDU | = | 0.173017 |

Taken together, (0.00399136, 0.173017) is a 90 % two-sided confidence interval for the BMD

Cancer Slope Factor = 25.0541

3. BMD-modelling for Yuen *et al.* (1995) study. Data from table 1 (non-pregnant rats). The sum of all degrees of changes (i.e. mild, moderate and sever) in liver morphology were used as input variables. The endpoint confluent necrosis was not modelled due to lack in dose-response (only one positive dose group).

Endpoint 1: Fatty change



Log-Logistic Model, with BMR of 10% Extra Risk for the BMD and 0.95 Lower Confidence Limit for the BMDL

P[response] = background+(1-background)/[1+EXP(-intercept-slope*Log(dose))]

The form of the probability function is:

```
Dependent variable = FattyChange
Independent variable = Dose
Slope parameter is restricted as slope >= 1
Total number of observations = 3
Total number of records with missing values = 0
Maximum number of iterations = 500
Relative Function Convergence has been set to: 1e-008
Parameter Convergence has been set to: 1e-008
User has chosen the log transformed model
Default Initial Parameter Values
background = 0.33333
intercept = -1.03625
slope = 4.64386
```

Asymptotic Correlation Matrix of Parameter Estimates

| | background | intercept |
|------------|------------|-----------|
| background | 1 | -0.45 |
| intercept | -0.45 | 1 |

Parameter Estimates

| | | | 95.0% Wald Conf: | idence |
|-------------|----------|-----------|-------------------|--------|
| Interval | | | | |
| Variable | Estimate | Std. Err. | Lower Conf. Limit | Upper |
| Conf. Limit | | | | |
| background | 0.333332 | * | * | |
| * | | | | |
| intercept | -4.01656 | * | * | |
| * | | | | |
| slope | 18 | * | * | |
| * | | | | |

 \star - Indicates that this value is not calculated.

Analysis of Deviance Table

| Mod | lel | Log(likelihood) | # | Param' | s | Deviance | Test | d.f. | Ρ | -value |
|---------|-------|-----------------|---|--------|----|------------|------|------|---|-----------|
| Full | model | -15.2763 | | 3 | | | | | | |
| Fitted | model | -15.2764 | | 2 | 6. | 10343e-005 | | 1 | | 0.9938 |
| Reduced | model | -22.9145 | | 1 | | 15.2763 | | 2 | | 0.0004817 |

| ATC: | 34.5527 |
|------|---------|
| | 51.5527 |

| | | Good | dness of Fit | _ | Scaled |
|------------------|------------------|----------------|--------------|----------|-----------------|
| Dose | EstProb. | Expected | Observed | Size | Residual |
| 0.0000 1.2500 | 0.3333 0.6667 | 4.000 8.000 | 4.000 8.000 | 12 12 | 0.000 -0.000 |
| 2.5000 | 1.0000 | 12.000 | 12.000 | 12 | 0.006 |

Chi^2 = 0.00 d.f. = 1 P-value = 0.9956

Benchmark Dose Computation

| Specified effect | = | 0. | , 1 |
|------------------|---|----------|-----|
| Risk Type | = | Extra ri | ∟sk |
| Confidence level | = | 0.9 | € |
| BMD | = | 1.1063 | 36 |
| BMDL | = | 0.27350 |)1 |

Endpoint 2: Focal necrosis



Log-Logistic Model, with BMR of 10% Extra Risk for the BMD and 0.95 Lower Confidence Limit for the BMDL

| Maximum numb Relative Fun Parameter Co | r of iterations = 500 tion Convergence has been set to: 1e-008 vergence has been set to: 1e-008 | |
|--|--|--|
| User has cho | en the log transformed model | |
| | Default Initial Parameter Values background = 0.25 intercept = -0.741267 slope = 4.32193 | |
| Asym | totic Correlation Matrix of Parameter Estimates | |
| (** specified by th | The model parameter(s) -slope have been estimated at a boundary point, or have been user, and do not appear in the correlation matrix) | |
| ba | kground intercept | |
| background | 1 -0.38 | |
| intercept | -0.38 1 | |

Parameter Estimates

| 95.0% Wald Confidence | ence | Confide | Wald | 0% | 95. |
|-----------------------|------|---------|------|----|-----|
|-----------------------|------|---------|------|----|-----|

| Interva | al | | | | |
|---------|-----------|----------|----------|---------------|-------------|
| | Variable | Estimate | Std. Err | . Lower Conf. | Limit Upper |
| Conf. 1 | Limit | | | | |
| ba | ackground | 0.25 | * | * | |
| * | - | | | | |
| | intercept | -3.79342 | * | * | |
| * | - | | | | |
| | slope | 18 | * | * | |
| * | -1 - | | | | |

* - Indicates that this value is not calculated.

Analysis of Deviance Table

| Model | Log(likelihood) | # Param | 's Deviance | Test d.f. | P-value |
|---------------|-----------------|---------|--------------|-----------|-----------|
| Full model | -14.3862 | 3 | | | |
| Fitted model | -14.3862 | 2 | 5.49311e-005 | 1 | 0.9941 |
| Reduced model | -23.546 | 1 | 18.3196 | 2 | 0.0001052 |
| | | | | | |
| AIC: | 32.7724 | | | | |

| | | Good | ness of | Fit | |
|------|----------|----------|----------|--------|----------|
| | | | | | Scaled |
| Dose | EstProb. | Expected | Observed | l Size | Residual |
| | | | | | |

| 0.0000 | 0.2500 | 3.000 | 3.000 | 12 | 0.000 |
|---------------|---------------|----------|---------------|----|--------|
| 1.2500 | 0.6667 | 8.000 | 8.000 | 12 | -0.000 |
| 2.5000 | 1.0000 | 12.000 | 12.000 | 12 | 0.005 |
| Chi^2 = 0.00 | d.f. = | 1 P- | value = 0.995 | 8 | |
| Benchmark | Dose Computat | ion | | | |
| Specified eff | ect = | 0.1 | | | |
| Risk Type | = Ex | tra risk | | | |
| Confidence le | vel = | 0.95 | | | |

| BMD | = | 1.09273 |
|------|---|----------|
| BMDL | = | 0.241143 |

Endpoint 3: Dark cell change

Multistage Cancer Model, with BMR of 10% Extra Risk for the BMD and 0.95 Lower Confidence Limit for the BMI



Multistage Model. (Version: 3.4; Date: 05/02/2014) Input Data File: C:/USEPA/BMDS250/Data/msc_Nicotine Yuen et al. 1995_Nicotine Yuen et al. 1995.(d)

Gnuplot Plotting File: C:/USEPA/BMDS250/Data/msc_Nicotine Yuen et al. 1995_Nicotine Yuen et al. 1995.plt Thu Feb 05 10:05:08 2015 _____ BMDS_Model_Run _____ The form of the probability function is: P[response] = background + (1-background) * [1-EXP(-beta1*dose^1-beta2*dose^2)] The parameter betas are restricted to be positive Dependent variable = Darkcellchange Independent variable = Dose Total number of observations = 3 Total number of records with missing values = 0Total number of parameters in model = 3 Total number of specified parameters = 0Degree of polynomial = 2Maximum number of iterations = 500 Relative Function Convergence has been set to: 1e-008 Parameter Convergence has been set to: 1e-008 Default Initial Parameter Values Background = 0.084713 Beta(1) = 0 Beta(1) = 0.3728Asymptotic Correlation Matrix of Parameter Estimates (*** The model parameter(s) -Beta(1) have been estimated at a boundary point, or have been specified by the user, and do not appear in the correlation matrix) Background Beta(2) 1 Background -0.47 Beta(2) -0.47 1 Parameter Estimates 95.0% Wald Confidence

Interval Variable Estimate Std. Err. Lower Conf. Limit Upper Conf. Limit Background 0.203839 * *

| + | Beta(1) | 0 | * | |
|---|---------|---------|---|---|
| * | Beta(2) | 0.26957 | * | * |

* - Indicates that this value is not calculated.

Analysis of Deviance Table

| Model Full model Fitted model Reduced model | Log(likel -17.8 -18.0 -24.9 | Lhood) # 3282 5431 9533 | Param's 3 2 1 | Deviance 1.62984 14.2501 | Test | d.f. P 1 2 | -value 0.2017 0.0008047 |
|--|--------------------------------------|----------------------------------|------------------------|--------------------------------|-------|------------------|-------------------------------|
| AIC: | 41.2 | 2863 | - | 11.1001 | | | |
| | | Goo | odness o | f Fit | | | |
| Dose E | stProb. | Expected | Obser | ved Si | ze | Scal Resid | ed ual |
| 0 0000 | 0 2038 | 2 446 | 3 000 | 12 0 | 0.0 | 0 39 | 7 |
| 1.2500 | 0.4775 | 5.730 | 4.000 | 12.0 | 00 | -1.00 | 0 |
| 2.5000 | 0.8523 | 10.228 | 11.000 | 12.0 | 00 | 0.62 | 8 |
| Chi^2 = 1.55 Benchmark Do | d.f. = 1 se Computatio | P- | -value = (| 0.2128 | | | |
| Specified effec | :t = | 0.1 | | | | | |
| Risk Type = Extra risk | | | | | | | |
| Confidence leve | 1 = | 0.95 | | | | | |
| BMD = 0.625177 | | | | | | | |
| BMD | L = 0.2 | 213503 | | | | | |
| BMD | U = 0.9 | 908647 | | | | | |
| Taken together, interval for th | (0.213503, (e BMD |).908647) | is a 90 | % two- | sided | confiden | ce |

Cancer Slope Factor = 0.468378