Abstract: The purpose of this study is to assess the concentration-response relations between conjunctivitis and exposure to ambient ozone. This retrospective study includes emergency department (ED) visits for conjunctivitis in Edmonton, Canada, for the period April 1992 – March 2002. Daily average levels of ozone, of temperature and relative humidity were estimated and used for the period of the study. For each of the considered exposure lags, from 0 to 9 days, six various models were fitted to estimate the concentration-response function. The goodness of fit was assessed using Akaike information criterion. During the period of the study, 17,211 ED visits for conjunctivitis were recorded and used. For all subjects together, a positive statistically significant association was obtained for the exposure lagged by 5 days. For female subjects, lags 1, 3, and 9 had positive statistically significant associations (lag 2 had negative associations). For male subjects only lag 5 had a positive statistically significant association. The estimated non-linear concentration-response functions for the considered groups (all, males, females) and lags, revealed the associations along the exposure levels. The fitted shapes are described by the parameters and may have various forms. The estimated function are useful to determine the risk associated with exposure to ground-level ozone.

Keywords: Air pollution; Conjunctivitis; exposure; Linear; Model; Case-crossover; Poisson

1. Introduction

This presentation focuses on the methodological aspects of environmental epidemiology. The technique proposed here reveals associations of conjunctivitis with ozone as concentration-response curves. The goal of the present paper is to re-analyze the data used in the previous publication (Szyszkowicz et al. 2010a), but with a different methodological approach. The applied methodology allows to fit various type of concentration-response functions and not only linear as it is assumed in the traditional technique (Szyszkowicz, 2018) realized in the form of log-linear models. The original publication only demonstrated the positive statistically significant association for ozone lagged by 5 days. It is interesting to explore these relations more fully and to verify the associations for other lags and also by sex.

The conjunctiva, is composed of non-keratinized, both stratified squamous and stratified columnar epithelium, together with interspersed goblet cells. As it is highly vascularized and constantly exposed to the external environment, the conjunctiva is vulnerable to various harmful factors such as viruses, bacteria, allergens, and chemicals, thereby resulting in conjunctivitis (Fu et al. 2017). In the United States, three to six million people suffer from conjunctivitis per year (Azari and Barney, 2013; NEI, 2015) and it is the most common ocular condition diagnosed in US emergency departments (Alabbasi et al. 2017; Carvalho and Jose, 2007; Channa et al. 2016).

The prevalence of conjunctivitis according to sex is not clear. Several studies found a high prevalence of allergic conjunctivitis in females (Ramirez et al. 2017; Szyszkowicz et al. 2016; Geraldini et al. 2013; Kumah et al. 2015) while others showed the opposite trend (T.Y.O. Yang et al. 2018).
There is a small number of epidemiological studies which have investigated the association of conjunctivitis with ambient air pollution exposure. Some of these studies indicate ambient ozone as a risk factor for emergency department (ED) visits (Szyszkowicz et al. 2010a; Szyszkowicz et al. 2016; Lee et al. 2017) along with other ambient air pollutants (Chang et al. 2012; Kousha and Castner, 2014; Mimura et al. 2014; Hong et al. 2016; Li et al. 2016; Nucci et al. 2017; Fu et al. 2017). One of the first studies concerning this connection reported results on the exposure to ground-level ozone and ED visits for conjunctivitis in Edmonton, Canada (Szyszkowicz et al. 2010a). The Taiwan multi-city study (Chang et al. 2012), found a high levels of O3 and increase chances of an ED visit, in the immediate post-exposure period, for the patients suffering from nonspecific conjunctivitis. However, the study tested the cumulative exposure, accumulated in the period of up to 5 days preceding the ED visit. In addition to conjunctivitis, the ozone (O3) effects on various skin conditions and cellulitis (Szyszkowicz et al. 2010a; Szyszkowicz et al. 2010b; Szyszkowicz et al. 2012).

The standard approach in environmental epidemiology studies is to realize log-linear models, in time-series analysis, considering counts or in case-crossover analysis, considering separate health events. The estimated relative risk (RR) or odds ratio (OR) are usually shown as one value for a specified air pollution concentration level, say D. They are calculated using the exponential function with the estimated coefficient (slope, beta) and concentration D (RR=exp(beta*D) or OR=exp(beta*D)). In this presentation we proposed to use various forms of the concentration-response functions, not only exponential.

2. Materials and Methods

2.1 Used data

ED visits for conjunctivitis in Edmonton, Canada, were collected for the period April 1992 – March 2002, (Szyszkowicz et al. 2010a). The data on ED visits were organized by Alberta Health Services–Edmonton Zone for all five major acute care hospitals in the Edmonton area. In this 10 year time period, 2,951,878 diagnosed ED visits were recorded. All ED charts were coded by trained medical record nosologists using the International Classification of Diseases, 9th Revision (ICD-9) codes. ICD-9 codes 372.0-9 were applied to identify the conjunctivitis cases from the ED database. There were not any inclusion/exclusion criteria.

Health outcomes measured as ED visits, daily average of 24 hour concentration levels of ozone, daily average of temperature (dry bulb) and relative humidity has been estimated for the period of the study. The environmental data were measured, recorded and provided by Environment Canada (For the details please see NAPS Web site: https://www.ec.gc.ca/rnspa-naps/).

2.2 Statistical analysis

A case-crossover (CC) method with a time-stratified approach to select the corresponding controls was used (Maclure, 1991; Janes et al. 2005). In the CC method a person plays two roles; a case and own perfectly matched control on attributes that are not time-varying, as age, sex, and comorbidity or similar characteristics. The exposure related to the event-period and to control-period(s) is considered and compared as the risk factor. For example, for any health case on October 18, 2017, the days October 4, 11 and 25 are the control days. We may apply the standard CC method in our analysis, but as the CC method works with individual events, it is better to use its equivalent modification (Szyszkowicz, 2006; Armstrong et al. 2014; Szyszkowicz and Burr, 2016). In this way, there is smaller amount of data to process and to use in the related calculations. This approach (cases vs. controls) uses the daily counts rather than individual daily events. For example, 5 events in a specific day will result in 20 or 25 data records (5 cases and 5x3= 15 or 5x4=20 controls) but will be used as 5 daily counts. In the standard CC method logistic regression models are relaxied. In this presentation the CC method is realized by using conditional Poisson models (Armastrong et al. 2014).

In the constructed statistical models, temperature and relative humidity are represented in the form of natural splines to adjust for nonlinearity. These two weather factors are used as covariates in the constructed models. They were lagged by the same number of days as ambient ozone values.

Ground-level ozone (O3) was considered as the exposure. In the constructed models we used three forms of the transformation function f(z), where z=O3. These functions were f(z)=z, f(z)=log(z),
and a square root of $z$, $\sqrt{z}$. In addition, these functions were regulated by the logistic weighting function. The constructed models used the product of $f(z)$ and the logistic functions to represent the exposure. The exposure ($z$) was transformed and in such form was incorporated into the statistical model, controlling variation of the shape of the concentration-response functions (Nasari et al. 2016; Szyszko, 2018; Burnett et al. 2018).

Representing the concentration levels by the variable $z$, we applied the following formula to calculate relative risk (RR) as the function of the variable $z$, $RR(z) = \exp(\beta(z))$. The used formula for $\beta(z)$ has the following form

$$\beta(z) = \beta \times \frac{f(z)}{1 + \exp\left(\frac{\mu - z}{\tau + \tau}\right)}$$

where $r$ is the range of the concentration levels, $\mu$ (mu) and $\tau$ (tau) are the parameters of the logistic function. For given values of the parameters mu and tau we estimated the coefficient $\beta$ (Beta).

We applied a case-crossover design to realize this model. As we realized conditional Poisson models rather than conditional logistic regression models we used term relative risk rather than odds ratio.

The note under Figure 2 presents an example of the specific mathematical form of the realized formula. Here we fitted and tested six models, i.e. separately for each of three transformation functions, with two values (parameter tau; 0.1 and 0.2) of the curvature parameter (see Figure 2). The best model is chosen among the evaluated six models (three forms of $f(z)$ and for each two values of tau) applying the goodness of fit criterion.

Ozone and the weather parameters were lagged from 0 (the same day as ED visits for conjunctivitis) to 9 days (the exposure 9 days before the event day). For each lag and among the constructed six models we choose the method which gave the best fit. The quality of approximation was measured by the Akaike Information Criterion (AIC) value (Akaike, 1973). The model with the lowest AIC was classified as the best among used and tested. Calculations were done for all patients, males, and females. The included figures present the results for all patients.

3. Results

There were 17,211 ED visits for conjunctivitis: 9,046 (53%) males, and 8,165 (47%) females. Among the identified cases were the following number of ED visits and types: 5,019 (ICD-9: 372.0; Acute conjunctivitis), 1,635 (ICD-9: 372.1; Chronic conjunctivitis), 7,869 (ICD-9: 372.3; Others and unspecified conjunctivitis), 2,409 (ICD-9: 372.7; Conjunctival vascular disorders and cysts), and 280 cases for other types of conjunctivitis.

During 10 years of the study the frequency of ED visits for conjunctivitis by days of week was as follows: Sunday – number of cases: 3,318 (percentage of all visits: 19.3%), Monday – 2,433 (14.1%), Tuesday – 2,119 (12.3%), Wednesday – 1,994 (11.6%), Thursday – 2,063 (12.0%), Friday – 2,353 (13.7%), and Saturday – 2,931 (17.0%). May, June and July were the months with the highest frequencies: 1,967 (11.4%), 1,763 (10.2%), 1,703 (9.9%), respectively, and February was the month with the lowest number of visits: 1,050 (6.1%).

Table 1 summarizes the results for the six statistical models. It presents the lag (from 0 to 9 days), and the number of models (among six) which categorized the results as positive and statistically significant (estimated slope, Beta) at two levels of the criteria (P-Value): 0.05 and 0.2. For some lags we observed positive associations which was not statistically significant. Therefore, we used an additional criterion P-value = 0.2 to verify if positive associations persisted for various considered models. It allows us to assess for associations when the results are not statistically significant. For lag 5, this value in both cases is 6, i.e. the estimated coefficient (Beta) was statistically significant (P-value < 0.05) for each of six models.
Table 1. The best obtained models for the considered lagged exposure to ambient ozone.

<table>
<thead>
<tr>
<th>Lag</th>
<th>P&lt;0.05</th>
<th>P&lt;0.2</th>
<th>Function</th>
<th>tau</th>
<th>mu</th>
<th>Beta</th>
</tr>
</thead>
<tbody>
<tr>
<td>0</td>
<td>6</td>
<td>log(z)</td>
<td>0.1</td>
<td>29.3</td>
<td>0.0278</td>
<td></td>
</tr>
<tr>
<td>1</td>
<td>4</td>
<td>log(z)</td>
<td>0.1</td>
<td>4.2</td>
<td>0.0266</td>
<td></td>
</tr>
<tr>
<td>2</td>
<td>0</td>
<td>z</td>
<td>0.2</td>
<td>-96.8</td>
<td>0.0026</td>
<td></td>
</tr>
<tr>
<td>3</td>
<td>5</td>
<td>log(z)</td>
<td>0.1</td>
<td>16.1</td>
<td>0.0284</td>
<td></td>
</tr>
<tr>
<td>4</td>
<td>5</td>
<td>log(z)</td>
<td>0.1</td>
<td>18.8</td>
<td>0.0248</td>
<td></td>
</tr>
<tr>
<td>5</td>
<td>6</td>
<td>log(z)</td>
<td>0.1</td>
<td>18.6</td>
<td>0.0392</td>
<td></td>
</tr>
<tr>
<td>6</td>
<td>0</td>
<td>log(z)</td>
<td>0.1</td>
<td>-53.8</td>
<td>0.0081</td>
<td></td>
</tr>
<tr>
<td>7</td>
<td>6</td>
<td>log(z)</td>
<td>0.1</td>
<td>8.64</td>
<td>0.0364</td>
<td></td>
</tr>
<tr>
<td>8</td>
<td>0</td>
<td>z</td>
<td>0.1</td>
<td>18.5</td>
<td>0.0008</td>
<td></td>
</tr>
<tr>
<td>9</td>
<td>2</td>
<td>z</td>
<td>0.2</td>
<td>40.5</td>
<td>0.0051</td>
<td></td>
</tr>
</tbody>
</table>

Note: P (<0.05, <0.2) shows how many models classified the results as significant at the given level. In the case P<0.2, the effect is observed but probably only a subset of ED visits is affected by ozone. z= O3. The estimated model (i.e. its main part directly related to the concentration-response) for the lags 0, 1, and 3-7 has the following form: W(z) = Beta*log(z)/(1+exp((mu-z)/r*tau)), where rtau = r*tau, and r is the concentration range. The parameters mu and tau characterise the logistic function. According to the used specifications, the relative risk values RR(z) = exp(W(z)).

Figure 1 illustrates the number of ED visits for conjunctivitis by sex and age, where age is in years. Ages 85 and above (85+) are shown as one point. The analysis of the ED visits by sex resulted in the following associations which are presented in Table 2.

Table 2. The best obtained models for the considered lagged exposure to ozone by sex.

<table>
<thead>
<tr>
<th>Lag</th>
<th>Male Beta</th>
<th>SE</th>
<th>mu</th>
<th>Female Beta</th>
<th>SE</th>
<th>mu</th>
</tr>
</thead>
<tbody>
<tr>
<td>0</td>
<td>0.0339</td>
<td>0.0262</td>
<td>34.8</td>
<td>0.0417</td>
<td>0.0262</td>
<td>15.6</td>
</tr>
<tr>
<td>1</td>
<td>67.0421*</td>
<td>68.9574</td>
<td>146.5</td>
<td>0.0652*</td>
<td>0.0288</td>
<td>-0.7</td>
</tr>
<tr>
<td>2</td>
<td>-0.0299</td>
<td>0.0264</td>
<td>21.6</td>
<td>-5.718*</td>
<td>2.5807</td>
<td>112.6</td>
</tr>
<tr>
<td>3</td>
<td>0.0013*</td>
<td>0.0019</td>
<td>14.2</td>
<td>0.0391*</td>
<td>0.0199</td>
<td>15.1</td>
</tr>
<tr>
<td>4</td>
<td>0.0238</td>
<td>0.0251</td>
<td>11.2</td>
<td>-0.0268</td>
<td>0.0198</td>
<td>18.6</td>
</tr>
<tr>
<td>5</td>
<td>0.0459*</td>
<td>0.0191</td>
<td>14.1</td>
<td>0.0034*</td>
<td>0.0019</td>
<td>19.0</td>
</tr>
<tr>
<td>6</td>
<td>-0.0146</td>
<td>0.0330</td>
<td>-51.2</td>
<td>0.0097</td>
<td>0.0207</td>
<td>12.0</td>
</tr>
<tr>
<td>7</td>
<td>0.0367</td>
<td>0.0235</td>
<td>5.3</td>
<td>0.0373</td>
<td>0.0201</td>
<td>13.8</td>
</tr>
<tr>
<td>8</td>
<td>-0.0173</td>
<td>0.0325</td>
<td>-15.3</td>
<td>0.0018*</td>
<td>0.0020</td>
<td>20.8</td>
</tr>
<tr>
<td>9</td>
<td>-0.0266</td>
<td>0.0311</td>
<td>-8.1</td>
<td>0.0116*</td>
<td>0.0055</td>
<td>46.1</td>
</tr>
</tbody>
</table>

Note: * f(z)=z identity was used, otherwise f(z)=log(z); † tau = 0.2 was used, otherwise tau = 0.1; SE – standard error, z= O3. The estimated models with statistically significant coefficients (P-Value<0.05) are marked by the star *.

For males only lag 5 indicates significant associations. For female patients, lag 1 and 3, have positive (lag 2 has negative) and statistically significant associations. The estimated associations are also positive for lags 5, 7, and 9, but non-significant (P-Value was greater than 0.05 but lower than 0.1).
Figure 1. Frequency of ED visits for conjunctivitis by sex and age. Edmonton, 1992-2002, Canada.

Figure 2 shows the results for the exposure lagged by 5 days for all patients. The association is positive and statistically significant (Table 1). The 95% confidence interval is also shown.

Figure 2. Concentration-response functions for the exposure lagged by 5 days. All ED visits for conjunctivitis in Edmonton, 1992-2002, Canada.

Figure 3 illustrates the concentration-response functions generated by the best model (chosen among six fitted) for the exposure related to lags 0, 1, 4, and 6. The standard CC method classifies the association for the lag 0, 1, and 4 as statistically non-significant. Using the methodology presented...
here, Figure 3 shows the association along the concentration for these lags. The panel for lag 6 shows that there is no association for the exposure on 6 days before the ED visit and the associations are not statistically significant (P-value > 0.05) for lags 0-1 and 4.

![Figure 3](image1.png)

**Figure 3.** Concentration-response functions for the exposure lagged by 0, 1, 4 and 6 days. All ED visits for conjunctivitis in Edmonton, 1992-2002, Canada.

### 4. Discussion

The main findings of the presented study are: confirmation the associations of ED visits for conjunctivitis with exposure to ambient ozone, estimation of the form of these associations with various concentration-response shapes, which provide better goodness of fit. The result does agree with Szyszkowicz et al. 2010a where for log-linear model for lag 5 also the estimated association was positive.

The used statistical methods in the present study are different from realized in previous studies (Maclure, 1991; Janes et al. 2005; Szyszkowicz et al. 2010a), where mainly the standard case-crossover method is used and realized as a conditional logistic regression model. The main advantage of the analysis applied in this study is the use of a non-linear concentration-response functions in the form of a mathematical formula (Nasari et al. 2016; Szyszkowicz, 2018; Burnett et al. 2018). In addition, we applied several models and determined the best fit among the considered variants. The reader may use the estimated parameters (Beta, mu, and tau) provided in Table 1, function f(z), and easily reconstruct Figure 2, which is for the lag 5. This result does agree with Szyszkowicz et al. 2010a where for log-linear model for lag 5 also the result was statistically significant positive. Of course, the same holds for other studied and presented models for the specified lags – using the estimated parameters it is possible to reconstruct concentration-response shapes.

The mechanisms by which air pollution impacts eye health is not clearly understood and there several pathophysiological mechanisms may explain this association. Pollutants can damage the tear film and directly expose the corneal and conjunctival epithelium to air pollutants, making the ocular surface vulnerable (Fu et al. 2017; Coles et al. 1984; Torricelli et al. 2013; Liu et al. 2009). Tear film abnormalities and subclinical changes of the ocular surface were found in individuals living in areas with high concentrations of pollutants (Saxena et al. 2003; Versura et al. 1999).

Conjunctival goblet cells are slow cycling cells that may proliferate in response to chronic inflammatory stimuli (Dartt 2004; Pellegrini et al. 1999; Wei et al. 1995). Recently, it was found that
pollutants can increase the number and density of goblet cells in the conjunctiva (Berra et al. 2015; Novaes et al. 2007; Torricelli et al. 2011, 2014) and increase interleukin-6 (IL-6) and interleukin-8 (IL-8) expressions in pollutant-treated human corneal epithelial cells (HCECs) and conjunctival epithelial cells (HCLEs, Tau et al. 2013; Xiang et al. 2016).

In addition, the pollution may increase oxidative stress, thus impeding the antioxidant defenses of the eye and inducing a cycle of inflammation and irritation, which strengthens allergen response, leading to clinical allergic conjunctivitis (Leonardi et al. 2011).

Ozone, produced by reactions between nitrogen oxides and volatile organic compounds in a process catalyzed by ultraviolet light, is regarded as one of the most toxic air pollutants to which humans are routinely exposed (Mudway et al. 2000; Lee et al. 2017).

Exposure to high concentrations of ozone has been reported to cause damage to the ocular surface and corneal epithelium, and increased inflammatory tear cytokine levels in a mouse model (Lee et al. 2013). In addition, exposure to ozone exacerbates deterioration of the ocular surface and amplifies the inflammatory state already induced by an allergic reaction, as evidenced by an increase in conjunctival chemosis, conjunctival injection, and corneal and conjunctival fluorescein staining scores including significant decrease in tear production (Lee et al. 2017).

Ozone pose high oxidative potential, and is able to cause damage to the ocular mucosa (Novaes et al. 2007; Fujishima et al. 2013) and may provoke conjunctival inflammation via chemical modifications of aeroallergens and subsequent enhanced allergic response (Jiaxu Hong et al. 2016).

In this study we considered all ED visits identified as conjunctiva problems. Not all of them are associated with exposure to ozone. Different types of conjunctivitis (ICD-9 codes: 372.0 – 372.9) were analysed with the following assumptions: if health outcome A (a subset of conjunctivitis related to air pollution) has a positive association with an air pollutant, health outcome B has a neutral (non-) association, and health outcome C has a negative association, then A+C considered together will have a tendency to have a neutral association. In the A and C categories where the relations are opposite, positive vs. negative, they will reduce the associations to null. Other combinations such as: A, and A+B, should have stronger associations than A+C. Among the considered ED visits for conjunctivitis are cases that don’t depend on exposure to ozone (type B). We don’t expect many negative associations (type C), i.e. such that are significantly negative. In our presentation we still observed the associations, even when we considered all cases and have a mixture of cases of different types (A+B+C). In our situation we probably analysed the variant A+B+C, with a small number of the type C cases. In other words, we expected positive associations or non-associations for ED visits for conjunctivitis and ozone. In one case (female, lag 2) we obtained statistically significant negative associations.

Figure 2 and 3 illustrate the shape of concentration-response related to exposure to ambient ozone and ED visits for conjunctivitis. We observed how this relationship changed along the concentration. It will be interesting to produce the concentration-response functions for other health outcomes. This was done previously, using the standard CC method, for 18 ICD-9 health groups to identify which air pollutant influences health (Szyszkowicz and Rowe, 2015). The approach presented here is more precise, and can be used to qualify (other estimations of the error) and quantify the air health effects.

5. Conclusions

The strongest associations between exposure to ambient ozone and ED visits for conjunctivitis was estimated for the exposure lagged by 5 days.

**Author Contributions:** Formal analysis, Mieczyslaw Szyszkowicz, Ariela Gordon Shaag and Einat Shneor; Investigation, Mieczyslaw Szyszkowicz and Ariela Gordon Shaag; Methodology, Mieczyslaw Szyszkowicz; Software, Mieczyslaw Szyszkowicz; Validation, Ariela Gordon Shaag and Einat Shneor; Visualization, Mieczyslaw Szyszkowicz; Writing – original draft, Mieczyslaw Szyszkowicz; Writing – review & editing, Mieczyslaw Szyszkowicz, Ariela Gordon Shaag and Einat Shneor. **Funding:** This research received no external funding.

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