Supplementary Information for

"Association between Oklahoma earthquakes and anxiety-related Google search episodes"

Supplemental Methods. Test Transfer Function

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Supplemental Methods.

Test transfer function:

We used Box-Jenkins methods (1) to identify and specify autocorrelation for our base model. These well-developed methods, which appear widely in the epidemiologic literature (2, 3), attribute autocorrelation to integration as well as to "autoregressive" and "moving average" parameters. Integration describes secular trends and strong seasonality. Autoregressive parameters best describe patterns that persist for relatively long periods, while moving average parameters parsimoniously describe less persistent patterns.

We estimated our test model by adding the monthly differences in M 4 earthquakes to our base model. We specified the model to include a "persistence" parameter that measured the proportion of the association, if any, between M 4 earthquakes and Oklahoma anxiety search episodes that carried into the month after the earthquakes. These steps yielded the following test transfer function:

$$\nabla Y_t^e = \frac{\omega_0}{(1 - \delta B)} \nabla X_{1t} + \omega_1 \nabla X_{2t}^e + \omega_2 \nabla X_{3t}^e + \frac{(1 - \theta B^q)}{(1 - \phi B^p)} a_t$$

 ∇ is the difference operator that implies transforming Y_t^e to its first differences (i.e., value at t subtracted from that at t+1) to render a trended variable stationary in its mean. Y_t^e is the natural logarithm of the proportion of anxiety Google searches in Oklahoma for month t. ∇X_{1t} is the number of earthquakes exceeding M 4 in Oklahoma for month t. X_{2t}^e is the natural logarithm of the proportion of anxiety Google searches in the US for month t. X_{3t}^e is the natural logarithm of

the proportion of toothache Google searches in Oklahoma for month t. ω_0 through ω_2 are the estimated coefficients of association, ω_0 is the primary coefficient of interest in our test. δ is the persistence coefficient that measures the proportion of ω_0 carried to month t+1. θ is the Box-Jenkins moving average parameter. ϕ is the Box-Jenkins autoregressive parameter. B is the "backshift operator" or value of Y_t^e at month t-p or of a at month t-q. a_t is the residual of the transfer function at month t. The residual series met the regression assumptions of independence, constant mean of 0, and constant variability around that mean. We hypothesized that ω_0 would be significantly greater than 0 (p<0.05; 2-tailed test).

Month	Year	US anxiety	OK anxiety	OK toothache
1	2010	1149.126	1368.288	250.7537
2	2010	1205.867	1674.979	190.7178
3	2010	1453.045	1663.688	660.7723
4	2010	1371.897	1957.559	301.5421
5	2010	1290.494	1234.506	310.7616
6	2010	1159.367	1235.986	240.3511
7	2010	1623.424	1865.333	236.5689
8	2010	1464.759	1826.469	307.6447
9	2010	1271.604	1483.285	170.2467
10	2010	1282.848	1443.681	261.2534
11	2010	1339.515	1817.383	359.4368
12	2010	1077.452	1334.498	205.4301
1	2011	1275.999	1307.045	251.9273
2	2011	1305.038	1318.908	216.4368
3	2011	1322.116	1237.391	189.2414
4	2011	1333.676	1550.214	197.1823
5	2011	1306.526	1166.361	252.077
6	2011	1286.001	1371.11	344.7319
7	2011	1306.312	1533.863	301.7317
8	2011	1315.27	1632.664	241.6276

9	2011	1374.292	1488.121	225.1638
10	2011	1390.015	1464.944	207.5576
11	2011	1351.835	1707.227	245.2805
12	2011	1239.527	1545.398	240.1345
1	2012	1563.932	1668.362	236.2152
2	2012	1548.018	1776.048	231.7717
3	2012	1513.587	1503.65	188.784
4	2012	1479.599	1595.026	299.1497
5	2012	1389.015	1199.222	273.8795
6	2012	1390.74	1410.88	193.8445
7	2012	1464.951	1718.908	197.9148
8	2012	1565.342	1995.617	250.0469
9	2012	1593.401	1770.501	237.3327
10	2012	1566.09	1748.025	206.8576
11	2012	1521.731	1731.177	213.147
12	2012	1455.943	1567.241	229.6956
1	2013	1583.156	1910.593	211.3188
2	2013	1576.039	1548.519	311.3442
Month	Year	US anxiety	OK anxiety	OK toothache
3	2012	1501 156	1642 775	225 ((52
	2013	1581.156	1643.775	225.6653
4	2013	1604.708	1842.071	225.6653
4	2013	1604.708	1842.071	210.6804
4 5	2013 2013	1604.708 1543.67	1842.071 1676.234	210.6804 200.9471
4 5 6	2013 2013 2013	1604.708 1543.67 1516.171	1842.071 1676.234 1799.24	210.6804 200.9471 244.3897
4 5 6 7	2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18	1842.071 1676.234 1799.24 1949.189	210.6804 200.9471 244.3897 170.6936
4 5 6 7 8	2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915	1842.071 1676.234 1799.24 1949.189 1875.803	210.6804 200.9471 244.3897 170.6936 260.153
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4 5 6 7 8 9	2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867
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4 5 6 7 8 9 10 11	2013 2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573 1540.325 1507.608	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46 1801.042 1662.382	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867 252.6993 295.8565
4 5 6 7 8 9 10 11 12	2013 2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573 1540.325 1507.608 1752.91	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46 1801.042 1662.382 1957.454	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867 252.6993 295.8565 253.7817
4 5 6 7 8 9 10 11 12 1 2	2013 2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573 1540.325 1507.608 1752.91 1655.289	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46 1801.042 1662.382 1957.454 1825.917	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867 252.6993 295.8565 253.7817 284.0233
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4 5 6 7 8 9 10 11 12 1 2 3 4 5	2013 2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573 1540.325 1507.608 1752.91 1655.289 1717.45 1689.637 1610.404 1615.539	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46 1801.042 1662.382 1957.454 1825.917 2007.736 1955.583 1990.833 1955.619	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867 252.6993 295.8565 253.7817 284.0233 227.9237 227.7322 233.4276 338.8595
4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7	2013 2013 2013 2013 2013 2013 2013 2013	1604.708 1543.67 1516.171 1579.18 1659.915 1693.587 1631.573 1540.325 1507.608 1752.91 1655.289 1717.45 1689.637 1610.404 1615.539 1648.171	1842.071 1676.234 1799.24 1949.189 1875.803 1921.94 1976.46 1801.042 1662.382 1957.454 1825.917 2007.736 1955.583 1990.833 1955.619 2172.537	210.6804 200.9471 244.3897 170.6936 260.153 246.9671 240.867 252.6993 295.8565 253.7817 284.0233 227.9237 227.7322 233.4276 338.8595 266.7723
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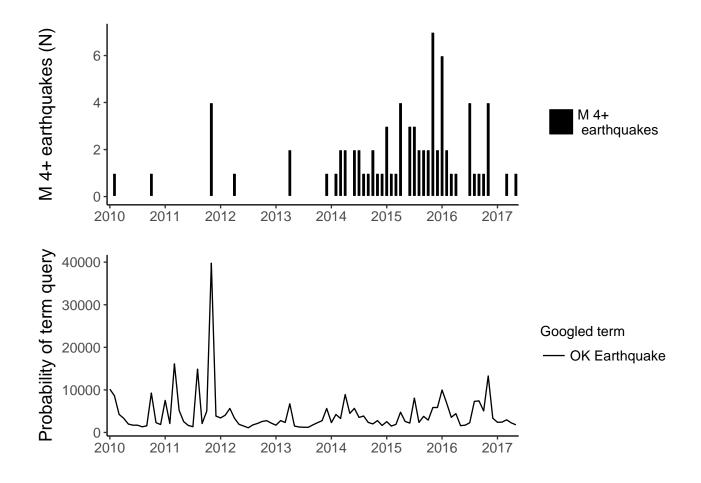
2014	1703.032	1985.334	217.5583
2014	1586.448	1706.955	229.2975
2015	1839.746	2047.004	229.3382
2015	1780.095	1889.947	230.9218
2015	1865.706	2110.256	176.369
2015	1901.433	2177.569	176.2277
2015	1813.026	2057.91	211.6951
2015	1838.536	2095.304	238.0718
2015	1941.547	2236.731	290.6044
2015	1974.576	2253.78	209.4959
2015	2088.621	2651.074	267.9362
2015	2089.183	2593.23	255.8388
2015	2000.286	2375.621	269.2541
2015	1881.969	2442.734	292.477
2016	2054.477	2720.393	248.8141
2016	2116.335	2607.3	273.092
2016	2136.062	2558.475	275.2412
2016	2204.857	2566.281	282.1523
Year	US anxiety	OK anxiety	OK toothache
2016	2090.357	2555.845	276.4442
2016			
2010	1979.595	2536.916	255.785
2016	1979.595 2159.241	2536.916 2899.342	255.785 274.982
2016	2159.241	2899.342	274.982
2016 2016	2159.241 2265.481	2899.342 2670.229	274.982 274.6512
2016 2016 2016	2159.241 2265.481 2287.279	2899.342 2670.229 2782.073	274.982 274.6512 307.8553
2016 2016 2016 2016	2159.241 2265.481 2287.279 2335.13	2899.342 2670.229 2782.073 2801.564	274.982 274.6512 307.8553 302.131
2016 2016 2016 2016 2016	2159.241 2265.481 2287.279 2335.13 2161.458	2899.342 2670.229 2782.073 2801.564 2927.637	274.982 274.6512 307.8553 302.131 216.984
2016 2016 2016 2016 2016 2016	2159.241 2265.481 2287.279 2335.13 2161.458 2021.111	2899.342 2670.229 2782.073 2801.564 2927.637 2696.493	274.982 274.6512 307.8553 302.131 216.984 332.0902
2016 2016 2016 2016 2016 2016 2017	2159.241 2265.481 2287.279 2335.13 2161.458 2021.111 2280.236	2899.342 2670.229 2782.073 2801.564 2927.637 2696.493 2722.682	274.982 274.6512 307.8553 302.131 216.984 332.0902 306.4075
2016 2016 2016 2016 2016 2016 2017 2017	2159.241 2265.481 2287.279 2335.13 2161.458 2021.111 2280.236 2327.987	2899.342 2670.229 2782.073 2801.564 2927.637 2696.493 2722.682 2955.815	274.982 274.6512 307.8553 302.131 216.984 332.0902 306.4075 280.3509
	2014 2015 2015 2015 2015 2015 2015 2015 2015	2014 1586.448 2015 1839.746 2015 1780.095 2015 1865.706 2015 1901.433 2015 1813.026 2015 1838.536 2015 1941.547 2015 2088.621 2015 2089.183 2015 2000.286 2015 1881.969 2016 2054.477 2016 2116.335 2016 2204.857 Year US anxiety	2014 1586.448 1706.955 2015 1839.746 2047.004 2015 1780.095 1889.947 2015 1865.706 2110.256 2015 1901.433 2177.569 2015 1813.026 2057.91 2015 1838.536 2095.304 2015 1941.547 2236.731 2015 1974.576 2253.78 2015 2088.621 2651.074 2015 2089.183 2593.23 2015 2000.286 2375.621 2015 1881.969 2442.734 2016 2054.477 2720.393 2016 2116.335 2607.3 2016 2204.857 2566.281 Year US anxiety OK anxiety

eTable 1. Monthly proportions of Google searches for specific terms from the Health category from January 2010 to May 2017.

Searches included anxiety search episodes across the United States and within Oklahoma and toothache search episodes within Oklahoma. Search probabilities were multiplied by 10 million for readability. Because Google uses a uniformly distributed random sample of 5-15% of Google web searches to calculate probabilities, updated once per day, the values in the table represent the average of 75 unique samples.

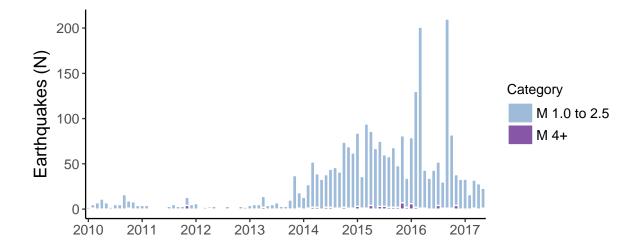
	Proportion monthly change in Oklahoma anxiety searches, B (95% CI) ^a			
Variable	Base model	Test model	Binary M 4 model	
Moving average at t-1	0.66 (0.47, 0.85)	0.58 (0.38, 0.78)	0.618 (0.42, 0.81)	
Autoregression at t-	0.38 (0.21, 0.54)	0.42 (0.23, 0.61)	0.45 (0.26, 0.63)	
12				

eTable 2. Moving Average and Autoregressive Parameters from Time Series Analysis ^a Estimates from a time series model for the proportion change in monthly Google anxiety search episodes per additional earthquake ≥ magnitude 4 in Oklahoma (Models presented in Table 1); n = 89 months (January 2010 to May 2017)



eFigure 1. Monthly total of $\geq M$ 4 earthquakes and Proportion of Google Searches in Oklahoma for the Term "earthquake" from January 2010 to May 2017.

We present the proportion of searches for earthquake, which we multiplied by 10 million for readability.



eFigure 2. Earthquakes per Month in Oklahoma During the Study Period.

The slate blue bars represent the number of M 1 to M 2.5 earthquakes^a per month and the purple bars the number of $\geq M$ 4 earthquakes per month as identified from the USGS Advanced National Seismic System catalog from January 1, 2010 to May 31, 2017.

^a The United States Geological Survey reports the magnitude of these smaller earthquakes using the Richter scale, also known as the local magnitude. ML and moment magnitude estimates are often similar. See: https://www.usgs.gov/faqs/moment-magnitude-richter-scale-what-are-different-magnitude-scales-and-why-are-there-so-many for additional details.

References

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