Research Article

Arsenic in Drinking Water and Lung Cancer Mortality in the United States: An Analysis Based on US Counties and 30 Years of Observation (1950–1979)

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Background. To examine whether the US EPA (2010) lung cancer risk estimate derived from the high arsenic exposures (10–934 μg/L) in southwest Taiwan accurately predicts the US experience from low arsenic exposures (3–59 μg/L).

Methods. Analyses have been limited to US counties solely dependent on underground sources for their drinking water supply with median arsenic levels of ≥3 μg/L.

Results. Cancer risks (slopes) were found to be indistinguishable from zero for males and females. The addition of arsenic level did not significantly increase the explanatory power of the models. Stratified, or categorical, analysis yielded relative risks that hover about 1.00. The unit risk estimates were nonpositive and not significantly different from zero, and the maximum (95% UCL) unit risk estimates for lung cancer were lower than those in USEPA (2010). Conclusions. These data do not demonstrate an increased risk of lung cancer associated with median drinking water arsenic levels in the range of 3–59 μg/L. The upper-bound estimates of the risks are lower than the risks predicted from the SW Taiwan data and do not support those predictions. These results are consistent with a recent metaregression that indicated no increased lung cancer risk for arsenic exposures below 100–150 μg/L.

1. Introduction

Arsenic is a known human carcinogen, whether the exposure is by ingestion or inhalation. Arsenic ingestion by populations exposed to arsenic concentrations in drinking water of at least several hundred micrograms per liter (μg/L) is associated with skin cancer, bladder cancer, and lung cancer [1]. A number of other sites have isolated positive findings, but skin, lung, and bladder cancer are consistently found to be increased with ingestion of high levels of arsenic [1].

The primary strong findings are in the Chilean studies where major parts of the population had average exposures of 600–860 μg/L [2] and in the SW Taiwan study where major parts of the population had high exposures of 300–590 μg/L and still higher exposures of ≥600 μg/L [3].

Cancer risk estimates for lower levels have generally been derived by backward extrapolation of risk at high levels. Cantor has observed that "most estimates of risk at low
and moderate levels of exposure (<200 μg/L) have been based on extrapolation from ecological studies of populations exposed to higher levels” [4]. In February 2010, the US Environmental Protection Agency (US EPA) circulated a never-finalized draft toxicological review of inorganic arsenic which presented unit risks for US male and female lung cancer incidences [5]. These risks were derived from high median arsenic exposure levels (mainly 300–934 μg/L) in SW Taiwan and were presented as the risks expected to have been experienced in the US where the population generally has low arsenic exposure levels (3–59 μg/L) [5].

While most epidemiological studies where drinking water arsenic levels are in the hundreds of micrograms arsenic per liter range do indicate a significant strong association for lung cancer [6], few studies report such risks in the lower range of <100 μg/L. A number of lung cancer studies showed no significant increased risk below 100 μg/L [7–11], while others did [2, 12, 13]. Other studies using either toenail or urine arsenic metrics found no increased risk in their low exposure groups [14, 15]. This study adds to the developing literature and provides more data points in the up to 60 μg/L arsenic range than do any of the other studies.

The current study is analogous to the male bladder cancer ecological study of 133 US counties (1950–1979) with median groundwater arsenic levels in the 3–59 μg/L range (measured in the period 1973–1998) [16]. The bladder cancer study found no arsenic-related increase in male bladder cancer mortality in that exposure range. The 95% upper-bound estimate of the risk was found to be lower than the risk predicted by the National Research Council (2001) but not that predicted by the US EPA (2001) [17, 18]. The NRC (2001) and US EPA (2001) risks had been based on Morales et al.’s (2000) dataset [19] for the 42-village study from SW Taiwan where median exposures ranged up to 934 μg/L presented in the NRC (2001) Table A10-1 [17–19].

This analysis of US counties lung cancer mortality expands upon that analysis of US counties bladder cancer mortality [16]. Specifically, it uses the same exposure and outcome data but now for lung cancer, for males and for females, and for a greater number of counties.

Further, we were able to obtain county-specific covariable information that had not been available ten years earlier. Finally, we were able to compare the 95% confidence limits based on the US observations and compared the upper-bound estimate with that predicted by the more recent US EPA [5, page 131].

2. Materials and Methods

This study is an ecological study with the goal of assessing the association between arsenic in drinking water and lung cancer. This study combined the county-specific median arsenic groundwater data from the US Geological Survey (USGS) [20] with the county-specific lung cancer mortality data for the period 1950 to 1979 from the National Cancer Institute (NCI) and US Environmental Protection Agency [21]. It was limited to those counties assessed by their state departments of health or of the environment to be solely dependent on groundwater for their drinking water supply, that is, having no surface water sources.

2.1. Exposure Measure. The exposure data come from the USGS National Water Information System [20] dataset that contained arsenic measurements from 67,440 wells with potable water. The data were collected in 1973–1998 and released in November 2001. The assessments of groundwater arsenic levels were made in the late 20th century and are assumed to reflect the groundwater arsenic levels back to the early 20th century. These are the earliest known national groundwater arsenic data.

USGS [20] developed a set of county-specific summary statistics of arsenic levels in potable groundwater well sources in μg/L. The summary statistics included the median, mean, and maximum values, as well as 10th percentile, 75th percentile, and 90th percentile levels for each county with sufficient data—each determined by USGS. Counties with fewer than five wells within 50 km radius of the center of the county were considered to have insufficient data for the calculation of summary statistics. This analysis only includes counties which the USGS [20] considered to have sufficient number of well sources to develop county-specific summary statistics. For each well, the latest specimen was used. All of these measurements had been made using hydride generation.

USGS [20] assigned a representative median arsenic concentration to each county, and we have used those county-specific values. There is no breakdown of subpopulations within the counties, so the median arsenic concentration is assumed to represent the exposure of the entire population. Of the 2,277 counties, 1,594 had sufficient data for computing summary statistics with medians of 1 μg/L to 59 μg/L and 682 did not. In parallel to the 2004 report on US bladder cancer mortality and groundwater arsenic levels, selection was limited to the counties with a median of 3 μg/L arsenic or higher (N = 268). State departments of health and of the environment were contacted to identify which of these counties were solely dependent on groundwater for their drinking water supply, that is, lacking surface water sources for drinking water. These data produced a set of counties (N = 186) that could be included in the analysis. The range for the median arsenic exposure of these 186 counties was 3–59 μg/L arsenic.

2.2. Outcome Measure. The outcome data came from the NCI/EPA report on US County Cancer Mortality Rates and Trends, 1950–1979 [21]. The lung cancer data in the NCI/EPA 1950–1979 cancer mortality report was presented as counts and age-adjusted rates (adjusted to the 1970 US population) for each decade and separately for the four race- gender demographic groups—white males, white females, nonwhite males, and nonwhite females. Nonwhites included African-Americans, American Indians, and Asians. Such data existed for the US, each state, and each county in the 48 states that comprised the USA in 1950 (i.e., excluding Alaska and Hawaii which became states in 1959). Lung cancer mortality data that included at least one lung cancer death and an annual average
2.3. Covariables. Potential demographic county level covari-
able things of education (percent of non-high school graduates),
rural (percent of the rural), poverty (percent of those below
75% of the poverty level), and income (median household
income) came from the 1970 US census data [22]. Education,
rural, and poverty data were obtained through the National
Historical Geographic Information System (NHGIS) [23].
Nativity (percent of cancer deaths to person born in state)
came from US Vital Statistics 1979 [24]. County-average soil
arsenic levels (including sediment) were available from the
USGS National Geochemical Survey for all 173 counties [25]
and were included as a proxy for dietary arsenic. County-
specific smoking rates for males and females were available
based on the 1996 Behavioral Risk Factor Surveillance System
(BRFSS) data [26, 27]. The US Census Bureau provided the
county population data [23].

2.4. Analytic Methods. A scatterplot of the county SMRs on
the county median groundwater arsenic levels was visually
examined to assess both linearity of relationships and the
occurrence of disparate elements (outliers). Regression anal-
yses were tested with both a linear and a quadratic term
in order to assess for nonlinearity. The quadratic term to
the model was not found to be significant, which excluded
at least one form of a nonlinear relationship. Population-
weighted least square regression analyses adjusted for the size
of each population were conducted to reduce the effect of the
wide range of population sizes across the counties. The 1960
white male and female populations were used to represent the
1950–1979 period as it was more representative of the prior
years. Multiple linear regression analyses were conducted to
determine which covariates were significantly related and to
adjust for their effects. Statistical significance was based on a
two-tailed \( p < 0.05 \). The multivariate analyses provide a
sensitivity analysis with respect to the examined covariates.

Backward elimination strategy was used to select a final
model based on the \( p = 0.05 \) significance level. The analysis
began with all the variables included in the model and
followed with sequential removal on the basis of statistical
significance. The final model contained only those variables
that each remained as statistically significant predictors.

Further, hierarchical linear regression analysis was con-
ducted to assess the significance of the unique variance addi-
tionally contributed by the median groundwater arsenic level
to the SMRs analyses. Regression analyses were conducted
using Stata 11.0 [28], and scatter plots with trend lines were
constructed using Excel [29]. As an alternative, a stratified
linear regression relative risk analysis was conducted that
provides a more granular look at the pattern of the SMR
over the exposure range. The SMR for each stratum was the
average of the SMRs for the counties in that stratum, and
the exposure for each stratum was the population-weighted
average of the median exposures for those same counties.
The relative risks were calculated as the ratio of the SMR in the
exposure strata divided by the SMR in the reference exposure
level, a median exposure of 3.0 \( \mu g/L \).

Analysis was extended to determine the "unit risk," that
is, the increased lifetime risk of being diagnosed with lung
cancer per lifetime average increased exposure to 1 \( \mu g/L \)
arsenic in drinking water. This unit risk for lung cancer and
drinking water arsenic exposure was derived from the US
data. As the "unit risk" is a linear function in concept and in
use, the unit risk analyses have been conducted using arsenic
level as a linear function. The maximum unit risk is the 95%
upper confidence bound of the unit risk and is the maximum
unit risk that is still compatible with the underlying data.

The coefficient (slope) for arsenic in the regression anal-
yses was converted to a unit risk estimate in a series of steps.
The national background 1950–1979 lung cancer mortality
rates in the NCI/US EPA [21] report (46.8/100,000 PYs for
US white males and 9.3/100,000 PYs for US white females)
were converted to lifetime lung cancer mortality risks with
the assumption of an average 70-year lifetime. This yielded
lifetime lung cancer mortality risks of 0.0327 (46.8/100,000
* 70 = 0.0327) for males and of 0.0065 (9.3/100,000 * 70 =
0.0065) for females.

The baseline lifetime mortality risk at zero arsenic level in
drinking water for the study population was the product of
the lifetime mortality risk and the intercept from the
regression model. The lifetime mortality unit risk for arsenic
exposure was the product of the baseline lifetime mortality
risk at zero arsenic level and the coefficient (slope) for the
median arsenic exposures (\( \mu g/L \)).

The lifetime mortality risk for arsenic exposure was then
converted to a lifetime incidence unit risk for arsenic
exposure using the SEER data (1975–2010) [30] lung cancer
incidence to mortality ratio of 1.12 for males and 1.34 for
females. The total factor for converting the coefficient (slope)
for lung cancer mortality to a lifetime incidence unit risk was
0.0367 (0.0327 * 1.12 = 0.0367) for males and 0.0087 (0.0065 *
1.34 = 0.0087) for females. The maximum lifetime incidence
unit risk for arsenic ingestion (per \( \mu g/L \)) was the largest unit
risk that would still be consistent with the underlying data
(95% upper confidence bound (95% UCB)). The maximum
unit risk (Max UR) for lifetime lung cancer incidence per
\( \mu g/L \) arsenic ingested was the product of the intercept, the
95% UCB, and the conversion factor.

The maximum URs derived here from the US data for
US males and females were compared with the lung cancer
unit risks predicted in US EPA [5] for the US male (1.9E – 4)
and for the US female (4.8E – 4) populations which had been
derived from the southwest Taiwan data [19]. The comparison
assesses whether the unit risks predicted from the SW Taiwan
data are compatible with the observed US data. Sensitivity
analyses were also performed to determine whether the wide
Table 1: Descriptive table for variables in analysis of lung cancer mortality risk for white males and white females in study counties with median groundwater arsenic level.

| Table 1: Descriptive table for variables in analysis of lung cancer mortality risk for white males and white females in study counties with median groundwater arsenic level. |
|---------------------------------|-----------------|-----------------|-----------------|
| Units                           | Mean            | Median          | Range           |
| **Dependent variable**          |                 |                 |                 |
| SMR (WM)                        | 0.9             | 0.89            | (0.42–1.37)     |
| SMR (WF)                        | 0.88            | 0.89            | (0.39–1.65)     |
| **Independent variable**        |                 |                 |                 |
| Median arsenic exposure μg/L (ppb) | 6.6             | 4.5             | (3.0–59.0)      |
| **Covariables**                 |                 |                 |                 |
| Education Percent < HS          | 47.3            | 46.8            | (26.0–74.0)     |
| Rural Percent of adults         | 68              | 67              | (5.0–100.0)     |
| Poverty Percent < 75th percentile | 11              | 9               | (3.0–36.0)      |
| Income Median income ($)        | 21,789          | 21,088          | (11,151–37,669) |
| Soil/sediment mg/Kg (ppm)       | 7.72            | 6.95            | (1.23–30.95)    |
| State born (M) Percent of Ca deaths | 57              | 65              | (0.0–100.0)     |
| State born (F) Percent of Ca deaths | 58              | 68              | (0.0–100.0)     |
| Current smoke (M) Percent of adults | 28.4            | 27.9            | (20.6–37.0)     |
| Current smoke (F) Percent of adults | 23.3            | 22.8            | (15.0–34.4)     |

SMR: standardized mortality ratio, HS: high school, HHInc: household income, M: male, F: female, Ca: cancer; two outlier counties (Deer Lodge, MT; Storey, NV) were excluded.

range of county characteristics (numbers of wells, population, and area) had a significant effect on the outcome.

Data on nonwhites had not been included in the main analysis both because the small number of eligible counties (28 counties for males and 13 counties for females) made them unlikely to be representative of the nonwhite US population and because the county covariables (education, poverty, median household income, and rural) were unlikely to have been applicable to the nonwhite population. Because of the small number of counties meeting the outcome criterion for nonwhite males or females, the analysis in this report was limited to the data on white males and females.

3. Results

Of the 186 counties that met the exposure criteria, 173 counties (173/186 = 93%) met the outcome criteria for white males, 133 for white females (133/186 = 71%), 27 for nonwhite males (27/186 = 15%), and 13 for nonwhite females (13/186 = 7%). The 173 counties with white male data were located in 26 states and included the 133 counties with the white female data. The analyses presented here have been restricted to the white population. The median arsenic levels for the counties with sufficient white lung cancer data ranged from 3 μg/L to 59 μg/L. The slopes were nonsignificant and negative.

Similar analyses were performed for the counties with sufficient nonwhite data. The median arsenic levels for the counties with sufficient nonwhite lung cancer data ranged from 3 μg/L to 17 μg/L. The slopes, also, were nonsignificant and negative. For those counties with sufficient white and nonwhite data for males and females, the slopes for white and nonwhite male lung cancer mortality were similar to each other, as were the slopes for white and nonwhite female lung cancer mortality (not shown).

Table 1 shows the descriptive statistics for covariables as well as those for the dependent variables for lung cancer (white male SMR and white female SMR) and for the independent variable (median arsenic exposure). The median arsenic levels ranged from 3 μg/L to 59 μg/L based on measurements from 7,669 wells in 173 counties with an average of 44 wells per county and a range of 5 to 510 wells per county.

The study counties are distributed generally across the contiguous 48 states except for the south and northeast sections (Figure 1). Nevada and Idaho in the west and South Dakota and Indiana in the north central regions had the most counties.

3.1. Simple Regression Analysis. The male SMRs ranged from 0.42 to 1.37 with extreme outliers of 1.79 and 2.10. The two counties (Deer Lodge County, Montana; Storey County, Nevada) with extreme outliers (Z ≥ 4.0) were excluded from the analysis. Both Deer Lodge County (arsenic = 59 μg/L) and Storey County (arsenic = 6 μg/L) had markedly excess lung cancer mortality for white males, but not for white females, suggesting an occupational etiology. Deer Lodge County, Montana, is the site of the Anaconda copper smelter, where studies have shown that respiratory cancer excess in the male population was due to high levels of arsenic inhalation [31, 32]. Storey County, Nevada, was a retirement area for underground gold miners, a group with known increased risk for respiratory cancer [33]. This background provides an explanation for the extreme rates which were observed only for the males.

The final 171 county analytic dataset for the males contained 33,304 lung cancer deaths, 78 million (78,172,710)
Figure 1: The distribution of study counties across the contiguous 48 states.

Figure 2: White male lung cancer SMRs (1950–1979) by median groundwater arsenic level (μg/L). Triangle—outlier male SMR (Deer Lodge County, Montana, and Storey County, Nevada).

Figure 3: White female lung cancer SMRs (1950–1979) by median groundwater arsenic level (μg/L).

person-years of observation, and a 1960 white male population of 2.6 million (2,605,757). Figure 2 shows the scatter plot of the white male lung cancer SMRs for the 171 counties analyzed with respect to their median groundwater arsenic levels. The SMR data for males regressed on the median groundwater arsenic levels showed a \( y \)-intercept at zero arsenic of 0.903 (95% CI, 0.864 to 0.942) and a negative but nonsignificant (\( p = 0.602 \)) slope of \(-0.0012\) (95% CI, \(-0.006\) to +0.003). Simple linear regression on the arsenic exposure data explained less than 0.2% of the variance of the SMR data for males (\( R^2 = 0.0016 \)).

The female lung cancer SMRs were found to have a range of 0.36 to 1.65, with no extreme outliers. The final 133 county analytic dataset for the females contained 7,778 lung cancer deaths, 76 million (75,696,150) person-years of observation, and a 1960 white female population of 2.5 million (2,523,205). Figure 3 shows the scatter plot of the white female lung cancer SMRs for the 133 counties analyzed with respect to their median groundwater arsenic level. The SMR data for females regressed on the median groundwater arsenic levels showed a \( y \)-intercept at zero arsenic of 0.897 (95% CI, 0.847 to 0.947) and a nonsignificant (\( p = 0.462 \)) negative slope of \(-0.0020\) (95% CI, \(-0.007\) to +0.003). Simple linear regression of the arsenic exposure data explained about 0.4% of the variance of the SMR data for females (\( R^2 = 0.0041 \)).

Analyses that excluded the two highest arsenic levels, that is, of data for arsenic level < 30 μg/L, yielded slopes of 0.000 for males (\( p = 0.91 \)) and for females (\( p = 0.36 \)) and with little explanatory power (\( R^2 < 0.004 \)). The maximum unit risks are calculated to be \(2.27E-04\) and \(3.64E-05\) for males and females, which reject the EPA predicted unit risk at the 90th and 95th percentiles, respectively.

Sensitivity analyses were carried out with respect to county characteristics of number of wells, population, and area. Analyses were restricted to eliminate the more extreme values of few wells, low population, and large area, each by one to two orders of magnitude. Sensitivity analyses were conducted on number of wells per county (≥5 to >50), population per county (>0.4K to >5K), and square miles per county (<25,000 to <1,500). In all cases, the slopes were similarly negative, and the intercepts were less than 1.00. Removal of the more extreme values had no effect on the analytic results. The slope was independent of data density (i.e., wells per square mile) with the slope and intercept for counties above the median (0.0011) and below the median (0.0013) being essentially equivalent, an issue raised by Ryker [32].

3.2. Multiple-Regression Analyses. Each white male lung cancer model contained data from 171 counties in 26 states. The arsenic coefficient (slope) was negative in the unadjusted model and positive in the adjusted models. Rural was the only significant variable in the arsenic model with all seven covariables. The unit risk was calculated to be \(-4.44E-5\) in the unadjusted model, \(1.62E-5\) in the model with all covariables, and \(1.05E-5\) in the model with the significant covariable (rural). A negative unit risk is interpreted as equal to zero. The maximum unit risk was \(1.05E-4\) in the unadjusted model, \(1.47E-4\) in the model with all covariables, and \(1.72E-4\) in the model with the significant covariable. Expansion of the adjusted model to include all seven covariables nearly doubled the explanatory power from 0.072 to 0.133. The maximum unit risk in each of the three models was less than...
the US EPA [5] predicted unit risk of $1.9 \times 10^{-4}$, rejecting it by a factor of 10–80% (or an average of 40%).

A model for male lung cancers with all seven covariables but without arsenic (not shown) as an explanatory variable had an $R^2$ of 0.1329, only slightly less than the $R^2 = 0.1332$ of the model with all seven covariables and arsenic. This indicated that arsenic increased the explanatory power by less than 0.05%. Hierarchical analysis showed a $p$ value of 0.808 for the arsenic variable.

Each female lung cancer model contained data from 133 counties in 25 states. The arsenic coefficient (slope) was negative in all three models. Poverty was the only significant variable in the arsenic model with all seven covariables. The unit risk was also negative in all three models and statistically indistinguishable from zero. The maximum unit risk was 2.62 $\times 10^{-5}$ in the unadjusted model, 3.32 $\times 10^{-5}$ in the model with all seven covariables, and 2.56 $\times 10^{-5}$ in the model with the significant covariable (poverty). Expansion of the adjusted model to include all seven covariables nearly quadrupled the explanatory power from 0.0246 to 0.0888. The maximum unit risk in each of the three models was less than the US EPA [5] predicted unit risk of 4.8 $\times 10^{-4}$, rejecting it by a factor of 14–19-fold.

A model for female lung cancers with all seven covariables but without arsenic (not shown) as an explanatory variable had an $R^2$ of 0.0876, only slightly less than the $R^2 = 0.0888$ of the model with all seven covariables and arsenic. This indicated that arsenic increased the explanatory power by only 0.0012 (i.e., 0.12%). Hierarchical analysis showed a $p$ value of 0.682 for the arsenic variable.

### 3.3. Stratified Analysis.

The lung cancer mortality data can also be aggregated into a stratified analysis (Table 2). This is analogous to the previously published male bladder cancer mortality data [16].

With a single exception, each of the SMRs is less than 1.00, and many of them are statistically significant (i.e., 95% UCL < 1.00). The SMRs are fairly consistent at about 0.90, probably reflecting that most of the counties had the lung cancer risk pattern of rural counties rather than those of the areas that were urbanized with industrial and environmental exposures and higher smoking rates.

Regression of the relative risks on the average of the median groundwater arsenic strata in each stratum indicated a consistent pattern (Figure 4). The relative risks hover around 1.00. Further aggregation of the data into strata of 3.1–9.9 $\mu g/L$ and 10.0–59.9 $\mu g/L$ with 3.0 $\mu g/L$ as the reference populations yielded relative risks of 1.01 and 0.98 for males and 1.01 and 0.97 for females, showing no increase in risk across the observed exposure range.

For both females and males, the slopes were slightly negative (−0.001 and −0.002, resp.), and their $p$ values (0.846 and 0.345, resp.) were not statistically significant. Visually, the slope for the female relative risks looks zero and that

### Table 2: Stratified analysis of male and female lung cancer mortality by median groundwater arsenic level ($\mu g/L$).

| As Median | County Wt Males | Counties Males | Cases Males | SMR Males | 95% CI Males | RR Males | County Wt Females | Counties Females | Cases Females | SMR Females | 95% CI Females | RR Females |
|-----------|----------------|---------------|-------------|-----------|--------------|----------|------------------|-----------------|--------------|-------------|---------------|-----------|
| 3.0       | 3.0            | 49            | 12,595      | 0.89      | (0.84–0.94)  | 1.00     | 3.0              | 42              | 3,026        | 0.89        | (0.81–0.96)  | 1.00      |
| 3.1–3.9   | 3.5            | 15            | 1,947       | 0.91      | (0.82–0.99)  | 1.02     | 3.5              | 13              | 455          | 0.90        | (0.77–1.03)  | 1.02      |
| 4.0–4.9   | 4.1            | 25            | 11,199      | 0.88      | (0.82–0.94)  | 0.97     | 4.1              | 21              | 2,907        | 0.89        | (0.81–0.96)  | 0.99      |
| 5.0–5.9   | 5.0            | 18            | 1,251       | 0.92      | (0.81–1.04)  | 1.05     | 5.0              | 11              | 235          | 0.87        | (0.73–1.02)  | 0.98      |
| 6.0–6.9   | 6.1            | 16            | 1,317       | 0.91      | (0.79–1.02)  | 0.98     | 6.1              | 11              | 251          | 0.93        | (0.82–1.05)  | 1.07      |
| 7.0–7.9   | 7.1            | 11            | 369         | 0.86      | (0.70–1.01)  | 0.94     | 7.2              | 6               | 61           | 1.05        | (0.80–1.30)  | 1.13      |
| 8.0–9.9   | 8.3            | 15            | 1,413       | 0.94      | (0.85–1.03)  | 1.10     | 8.4              | 10              | 223          | 0.75        | (0.58–0.92)  | 0.71      |
| 10.0–14.9 | 11.2           | 12            | 1,952       | 0.84      | (0.73–0.94)  | 0.89     | 11.3             | 10              | 385          | 0.87        | (0.72–1.02)  | 1.16      |
| 15.0–24.9 | 20.1           | 7             | 868         | 0.95      | (0.78–1.12)  | 1.13     | 20.4             | 5               | 170          | 0.84        | (0.57–1.10)  | 0.97      |
| 25.0–59.9 | 39.7           | 3              | 123         | 0.83      | (0.53–1.13)  | 0.88     | 41.2             | 3               | 31           | 0.82        | (0.67–0.97)  | 0.98      |

County Wt: county weighted, SMR: standardized mortality ratio, CI: confidence interval, RR: relative risk.

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**Figure 4:** Lung cancer relative risks regressed on county-weighted median groundwater arsenic strata ($\mu g/L$).

\[
y = -0.0007x + 1.0088 \\
R^2 = 0.0047, \ p = 0.85
\]

\[
y = -0.0021x + 1.0191 \\
R^2 = 0.0865, \ p = 0.41
\]
for the male relative risks nearly so. The maximum unit risks, 1.08E−04 for males and 2.62E−05 for females, are calculated to be less than the US EPA [5] predicted unit risks of 1.9E−04 and 4.8E−04, respectively. It is noteworthy that in spite of having consistently low SMRs the relative risk analysis demonstrates that within this exposure range the lung cancer risk is not dependent upon the drinking water arsenic level. The stratified data yield maximum unit risks that reject the EPA predicted risk by factors of 40% and 7-fold, respectively.

The results from the regression of the stratified data (Figure 4) are similar to those from the regressions of the disaggregated data (Figures 2 and 3). The stratified analysis, however, shows that the pattern is consistent across the exposure range and not the consequence of a significantly low finding at the high end of the exposure range.

4. Discussion

This is the first nationwide US study of the relationship between lung cancer mortality and the level of arsenic in the local drinking water supply. It shows no arsenic-related increase in lung cancer mortality (1950–1979) for US counties exclusively dependent on groundwater with median arsenic concentrations in the range of 3–59 μg/L for their drinking water supply.

This study is of special importance because it provides an opportunity to evaluate the US EPA [5] male and female lung cancer risk estimates for arsenic ingestion. US EPA [5, page 131] had developed unit risks for arsenic ingestion (lifetime lung cancer incidence risk per μg/L arsenic ingested) of 1.9E−4 for US males and 4.8E−4 for US females, which were based on the southwest Taiwan data. In contrast, our analyses which are based on US data found the unit risk to be 1.62E−5 for US males and a negative value (~8.69E−6) for US females in the fully adjusted model. Further, the maximum unit risks for arsenic ingestion (lifetime lung cancer incidence risks per μg/L arsenic) were found to be 1.47E−4 for US males and 3.32E−5 for US females in the fully adjusted models. Thus, the analysis of the southwest Taiwan data developed in US EPA [5] significantly overpredicted the lung cancer unit risks as experienced in the US.

Comparison with Analysis of SW Taiwan Data. The US EPA [5] lung cancer risk estimates were derived using lung cancer mortality data from the Morales et al’s dataset [19] for the Wu et al’s [3] study of the 42 villages in the Blackfoot- endemic area of southwest Taiwan. These villages had median arsenic exposures that ranged from 10 μg/L to 934 μg/L and a population-weighted average exposure of 305 μg/L. In contrast, the US study of 171 and of 133 counties had a median arsenic exposure range of 3 μg/L to 59 μg/L and a population-weighted average exposure of 5 μg/L. The analysis in this study demonstrates that the risk estimated from a population averaging 305 μg/L does not predict the risk experienced by a population averaging 5 μg/L. Similarly, an analysis of the southwest Taiwan data excluding the reference population demonstrated that the risk estimated for a population that included those with median, mean, or maximum exposures above 200 μg/L did not predict the risk among those with exposures below 100 μg/L [34].

The US study and the SW Taiwan study are both ecological studies that use local well water arsenic data and that lack individual exposure data; thus, results in each should be interpreted cautiously. In both cases, the analyses have been based on the median values. The median values do not incorporate the range of measurements but do represent a measure of their central tendency. In neither case is there information on what proportions of the populations used waters of different arsenic levels, so it is not possible to calculate population-weighted means, and medians have had to suffice as the representative exposure measure.

Both our analyses and those of the EPA were conducted in the 21st century and are based on data from the late 20th century. Our period of mortality is 1950–1979 and that of the EPA is 1973–1986, so they are temporally similar. While the most relevant exposure data for both studies would have been of drinking water arsenic levels from the late 19th century to the late 20th century, the earliest extant data are from 1973 to 1998 for the US data and from 1962 to 1964 for the SW Taiwan data. The USA counties were ascertained in 2000-2001 to be free of surface waters as drinking water sources, thus the assumption that the groundwater sources represented the actual exposure in not confounded with unascertained surface or piped water sources. In contrast, the well sampling for the SW Taiwan villages was in 1962–1964, some years after they had begun to receive surface or piped water in the 1950s. Thus wells that had been turned off or were not extant during 1962–1964 would not have been sampled, casting some doubt as to whether the sampled wells indeed represented the historic well water sources for the individual villages.

The US counties had a minimum of five sources and a median of 17 sources. Most of the villages in the SW Taiwan villages had measurement from a single source (22 of 42 villages) and the median was 2 sources. The US study was restricted to those counties that only used groundwater as their drinking water sources. Bottled water consumption at that time would not have been a confounding exposure as consumption in the 70s was only 5% of the consumption rate in the 2000s [35]. While clean water was brought to SW Taiwan villages starting in about 1956–1959, the SW Taiwan study had assumed that the wells sampled in 1964–1966 comprised all the wells that the villages had ever used and that no bottled water was used.

While the US study includes county-specific covariables, the SW Taiwan study had no village-specific covariables but instead assumed uniformity across all villages for all variables other than well water arsenic levels. The US study includes county data on standard demographic covariables—education, rural, poverty, and income—and the best available data on specifically relevant covariables—soil arsenic, nativity, and smoking. This would have brought in some consideration of arsenic exposures from smoking and from the consumption of locally grown foods but not of other dietary sources, such as rice. The US analysis here is limited to the white population, while the SW Taiwan population is
Taiwanese. The SW Taiwan results were then transposed to a mainly white population.

**Arsenic Exposure Data.** National US data on groundwater arsenic levels did not exist until 1973–1998. Their use here assumes that there was little change in the levels over the earlier decades. That assumption is not unreasonable. The USGS [20] did assess whether groundwater arsenic levels varied with time and concluded that “there probably is no relation between arsenic concentration and time for most wells.” Their time interval may have extended up to two decades. Similarly, a study in Argentina reported that groundwater arsenic levels showed a high degree of consistency over a 50-year period [36].

While we have no US data on the steadiness of groundwater arsenic levels over a half-century or more, we are not aware of any additional data from elsewhere that might examine that. D’Ippoliti et al. from Italy have argued that arsenic concentrations can be assumed to be stable where “arsenic contamination in groundwater (is) due to natural underlying geological processes and (in) the absence of any arsenic mitigation intervention” [15]. That may be applicable also for the US. The counties in this study were selected because they had not developed any surface water drinking water sources through the year 2000.

The USGS [20] dataset on groundwater arsenic levels in US counties included measures for the median, the mean, and the maximum levels, in addition to the 10th, 75th, and 90th percentiles. We used the median level as the measure of central tendency as the USGS had concluded that the median level represented “the true center of the data” and of central tendency as the USGS had concluded that the median level represented “the true center of the data” and of the skewed distribution had on the mean level [37]. We also conducted analyses using the 10th, 75th, and 90th percentiles as well as the mean and the maximum. In those models, all coefficients were nonsignificant and negative for both male and female lung cancers with the exception of maximum arsenic which was nonsignificant and positive (not shown).

**Nonwater Sources of Arsenic.** Food and soil provide additional alternative media for arsenic exposure. Again, data were not available prior to recent years. Xue et al. [38] showed for the USA an average dietary inorganic arsenic intake of 2 μg/day using 2003–2004 NHANES data. Similarly, Kurzius-Spencer et al., using the 2003–2004 NHANES data as well as two datasets from Arizona (1995–1997 NHEXAS and 2006–2007 BAsES), reported geometric mean dietary inorganic arsenic intakes of 6–8 μg/day [39, Table 3]. Further, Tao and Bolger [40, 41], using the 1991–1997 FDA Total Diet Study for Market Basket data, reported an average total inorganic arsenic intake of less than 10 μg/day for most people in the US. We have run the models with assumptions of either 2 or 10 μg/day arsenic from diet together with an ingestion of 1 or 2 liters of water per day and found no effect from the assumptions for dietary contribution.

Xue et al. [38] had found that vegetables were the primary contributor (24%) to dietary inorganic arsenic. We presumed that locally grown vegetables were a greater part of the diet in the earlier years and may have reflected local soil arsenic levels. Therefore, we used soil arsenic levels as a proxy for dietary inorganic arsenic. Two sources for county-averaged levels of arsenic in the soil—the USGS National Geochemical Survey [25] and USGS Geochemical and Mineralogical survey [42]—were used as covariables. No effect on the coefficient (slope), p value, or 95% upper confidence limit of the median groundwater arsenic variable in the model was found. We found no correlation with soil/sediment values and groundwater arsenic levels. While a recent US study had reported an association between soil/sediment arsenic values and lung cancer [43], we were unable to confirm it using either their data or ours.

Cigarettes are a known source of arsenic exposure. Agency for Toxic Substance and Disease Registry [44] reports that tobacco contains an average arsenic concentration of 1.5 μg/cigarette and yields a mainstream dosage of 0–1.4 μg/cigarette (midrange 0.7 μg/cigarette). The American Lung Association [45] reports that the average daily consumption of cigarettes per adult in 1996 was about 7 cigarettes per day. This would indicate a daily average consumption of about 5 μg arsenic per day from cigarettes in the year for which we give smoking prevalence. This 5 μg/day dosage would fit within the 2–10 μg/day nondrinking water sources of arsenic in the calculations above.

**Cigarette Smoking.** Cigarette smoking may contribute to the risk both as an additional source of arsenic exposure and for its effect on lung cancer risk. Smoking data, and in particular county-specific smoking data, were not available until the late 1990s. County-specific, gender-specific smoking rates are now available for the years 1996–2012 from the Behavioral Risk Factor Surveillance System (BRFSS) conducted by the Centers for Disease Control and Prevention [26, 27]. We have used the 1996 data, as they are the earliest available and closest to the time period of the observed mortality, and have used the assumption that the distribution of the 1996 county smoking rates reasonably reflects the relative distribution of the county-specific rates some decades earlier. We have used the above data to test this assumption by asking how well the smoking rates for 1996 and 2012 (an interval of 17 years) correlate. We found the correlation coefficient for county smoking rates over that 17-year interval to be 0.85 for males and 0.81 for females. Thus, we hold that it is not unreasonable to assume that the 1996 smoking rates distribution also reflects the county-specific smoking rates of previous decades. The US smoking rates were generally about 25% during the years of the BRFSS and about 40% during the years of the mortality observation [46]. We have assumed that, in spite of the general drop in the absolute smoking prevalence, the relative county-specific smoking prevalence has remained the same or similar.

ATSDR [44] noted that only with high levels of arsenic in drinking water did cigarette smoking increase the occurrence of lung cancer, citing cases of BFD disease in SW Taiwan [47] and exposures with very high arsenic levels [48]. Tsuda et al. [48] found an increased risk among smokers with exposure of ≥1,000 μg/L but not at the lower exposure of 50–990 μg/L. The Putila [43] analysis of soil/sediment arsenic as a risk factor for lung cancer showed that the
odds ratio for arsenic (1.004) did not differ whether smoking was or was not included in the analysis. Further, no significant interaction between smoking and arsenic exposure has been found at exposure levels below 90–100 μg/L [8, 10]. Additionally, Gebel et al. [49] reported that tobacco smoking did not have any influence on the contents of arsenic in urine or hair, and Demir et al. [50] reported no association between arsenic levels in lung cancer tissues and smoking status. Our observation of no association between lung cancer and smoking prevalence is consistent with the rest of the literature at exposures of less than 60 μg/L arsenic.

Natality. Both the previous bladder cancer study [16] and the SW Taiwan study [3] implicitly assumed that individuals were locally resident throughout most of their lives and at the time of their death. We have sought information on geographic mobility for the US counties. One metric that might have been used was the census data on the proportion of current residents that had been born in that place. However, those data are overweighted for the very young. As an alternative, we developed a metric using place of birth information on the 1979 US Vital Statistics public access data file for those who died from cancer (median age 62). We used as our metric the proportion of county cancer deaths that occurred to residents who were born in that same state. This metric was thus weighted to the age-group of interest. We observed that on average about 65–68% of the county residents dying from cancer had been born in the same state, suggesting that migration into the state may not have been such a major influence on the county cancer mortality rates.

Demographic Measures. County-specific demographic variables on education, rural, poverty, and income were obtained from the 1970 US census data. Thus, these data were contemporaneous with the period of mortality observation. The only variables that were significant in the multivariable analyses were rural in the analyses of male lung cancer and poverty in the analyses of the female lung cancers.

Limitations. Despite our finding that no arsenic-related increase in lung cancer mortality for US counties is exclusively dependent for their drinking water supply on groundwater with median arsenic concentrations in the range of 3–59 μg/L, there are potential limitations to our study. The major limitations are that this is an ecological study and that the county-specific exposure variable and covariable information are generally for time periods after the period of mortality (1950–1979). Such data for earlier time periods do not exist.

The first major limitation of this study is that, a characteristic of ecological studies, per se, all measures are aggregate data rather than individual data and thus susceptible to the ecological fallacy. Further, the exposure metric (median groundwater arsenic concentration for the county) is a composite measure that does not express the variability in within-county exposure levels. The working assumption is then that all residents of the county were exposed to the median arsenic level for that county. The outcome measure (relative lung cancer mortality risk) has considered age, sex, race, state, and decade of death.

These analyses are based on 1950–1979 mortality data with exposure and covariable data from the mid-1970s to the mid-2010s. In order to deal with regional variations in diagnostic patterns, the county-specific risks were calculated relative to the risks for their individual states. An alternative analysis might have been to match counties with other counties of similar urban/rural status. That, however, would have required a number of selection assumptions that would raise their own issues. A second alternative might have been to use a more recent lung cancer data base. That alternative is being pursued so that its findings can be compared with these along with the then–current regulatory analyses.

The second major limitation of this study relates to the absence of temporal concurrence of the exposure information and the covariables. The groundwater arsenic data for US counties were only measured at the end of the 1900s and have to be presumed to have not changed significantly or relatively since the beginning of the 1900s. There are no data on which to assess that presumption and analytic methods at that time would have been insensitive to the exposure range here.

Similarly, regarding the cigarette smoking prevalence, we are well familiar with the marked changes nationally over the decades of the 20th century but we can only assume that the relative prevalence has not grossly changed in the second half of the 20th century, which we recognize as a weak but necessary assumption. For the other covariables, the earliest available data have been used.

The limitations of the SW Taiwan study that underlies the US EPA Toxicological Report [19] are generally similar to those of the US counties study. However, covariables (other than age and gender) were not obtained but were assumed to not have varied across the villages or to have been different for the regional population. No smoking information was obtained.

4.1. Toxicological Model. Cohen et al. reviewed the toxicological literature evaluating the carcinogenicity of inorganic arsenic. They provided evidence for a mode-of-action (MOA) that involved the formation of reactive trivalent metabolites that interact with critical sulfhydryl groups, thus leading to cytotoxicity and regenerative cell proliferation [51]. They state that this MOA implies a nonlinear, threshold dose-response for both noncancer and cancer endpoints. Other MOAs might include genotoxicity and/or oxidative stress. US EPA notes that arsenic and its metabolites have not been found to induce gene (point) mutations and that a number of steps in the cytotoxicity-cell regeneration model may be stimulated by oxidative damage [5, page 99]. Snow et al. [52] had suggested a hermetic (biphasic) response at low concentrations, to which US EPA observed that "some low-dose effects (e.g., increased DNA repair) may be protective of carcinogenesis (and that) other effects (e.g., cell proliferation or telomerase activation) may … (at higher doses) permit mutant cells to survive by preventing cellular senescence and
death and ... (thus enhancing) arsenic's cancer-promoting capacity" [19, page 100].

In analyses on the SW Taiwan data that we have published elsewhere [53, 54], we have demonstrated high risks of both bladder and lung cancers with high levels (200–1,000 μg/L) of arsenic in the drinking water. In contrast, our analyses of the bladder and lung cancer data for the villages in SW Taiwan with low levels (<100 μg/L) demonstrated no exposure-related increased risk of either bladder or lung cancer in the 10–100 μg/L exposure range. Similar to our findings for the SW Taiwan villages with low levels of arsenic in the drinking water, we found no exposure-related increased risk of bladder cancer mortality in the US county data [16] and now we demonstrate the same for lung cancers in the US mortality data.

Other recent epidemiological studies show similar results at exposures of <100 μg/L, as does this ecological study. A recent case/control study from western USA (California and Nevada) reported lung cancer odds ratios of 0.75 and 0.84 for exposures of 11–84 μg/L (5-year average, 10-year and 40-year lag) compared to ≤10 μg/L [9]. Additionally, a recent case/control study from Chile with individual exposure levels all at <100 μg/L and determined over a 65-year period similarly found no significant increased risk for lung cancer across exposure tertiles (<10.1 μg/L, 10.1–59.9 μg/L, and >59.9 μg/L), whether lagged 5 years or 40 years (Web Table 4) [11].

The fact that the data from all these studies are consistent with the threshold model is intriguing, since recent toxicological findings indicate that arsenic carcinogenicity may follow a two-step process with cytotoxicity being followed by cellular proliferation and a no-effect level being observed [51].

A variety of studies are beginning to show other toxicological effects related to mechanisms occurring with arsenic exposures in the hundreds of micrograms per liter but not below. Niedzwiecki et al. [55] found significant decreases in global methylation of DNA in peripheral blood monocytes only at exposure of greater than 300 μg/L in the drinking water in Bangladesh. Similarly, Karakulak et al. [56] found that aortic elasticity parameters in arsenic-exposed workers diminished only when urinary arsenic levels exceeded about 150 μg/L.

4.2. Risk Modeling. This risk modeling has used a linear model both because that is the underlying assumption of a unit risk and because an added quadratic term was not statistically significant (p value of 0.636 for males and 0.555 for females). The unit risk is, by convention, consensus, and usage, restricted to be nonnegative, that is, either zero or positive. The regressions above yielded negative coefficients and negative best estimates of the unit risk. In no case was the finding statistically significant. Thus, it is reasonable to conclude from this modeling that the lung cancer unit risks in this range of exposure (3–59 μg/L) are indistinguishable from zero, an observation consistent with the threshold model. The 95% upper confidence limits of these unit risk estimates based on the US data were positive and were less than the lung cancer unit risks predicted in the US EPA [5] model based on the southwest Taiwan data. Thus, these data are inconsistent with the US EPA [5] linear no-threshold model that significantly overpredicted the lung cancer risks for the US population from the ingestion of drinking water containing arsenic in the 3–59 μg/L range.

In contrast, these data are consistent with the results of a more recent systematic review and metaregression analysis of lung cancer risk and inorganic arsenic in drinking water which found no increased lung cancer risk at arsenic exposures below 100–150 μg/L [6]. The metaregression analysis had found similar results for ecological studies (such as this one) and for nonecological (case-control and cohort) studies. Although ecological studies can be susceptible to the ecological fallacy, it is interesting to note that the analytic results and model fit from the ecological studies were equivalent to those from the nonecological (i.e., epidemiological) studies.

The US EPA [5] model considered a number of covariates or additional risk factors and then assumed that the exposures were similar across all the villages and thus differentially nondistinguishable. We have considered seven relevant covariates for which county-specific values were available. We have included them in our analyses. The use of the standard model that included the seven covariates for male lung cancers yielded a fit with p = 0.003, a positive unit risk, and a positive maximum unit risk which was less than the US EPA [5, page 131] predicted risk. The model explained ~13% (R^2 = 0.1332) of the variability in the SMR for males. The use of the standard model that included the seven covariates for female lung cancers yielded a fit with p = 0.160, a negative unit risk, and also a positive maximum unit risk which was less than the US EPA [5] predicted risk. The model explained ~10% (R^2 = 0.0888) of the variability in the SMR for females. When the standard model was restricted to inclusion of the significant covariates (rural in the male model and poverty in the female model), the explanatory powers were lower by a two- to fourfold factor but the maximum unit risks still were lower than those predicted by the US EPA model.

The observation is that for each linear model the best estimate of the slope over this exposure range of 3–59 μg/L arsenic is indistinguishable from zero and a relative risk that is not greater than 1.0. The same was true when the exposure range was limited to 3 μg/L to <30 μg/L. This is in contrast to the significantly positive slope and relative risks for lung cancer observed in other studies where the exposures are in the hundreds of μg/L arsenic. Taken together, these analyses suggest either a j-shaped, sublinear, or hornetic curve or alternatively a hockey-stick, or threshold, model. These data are inadequate to distinguish between these two models. For the most part, those analyses which in a univariate analysis show a statistically significant negative slope or reduced relative risk show in a multiple variable regression slopes that are indistinguishable from zero or relative risks indistinguishable from 1.0. Nonetheless, these data, showing no increased lung cancer risks with exposures below 60 μg/L, are sufficient to exclude the lung cancer unit risks proposed by the linear nonthreshold model presented in US EPA [5, page 131]. Further, the WHO (2001) JECFA1 report [57], using the 5-stratum NE Taiwan lung cancer data of Chen et al. [8],
found for a variety of models a \textit{de minimis} risk range for the BMD$_{0.5}$ equivalent to 59–102 $\mu$g/L. Thus, our findings are quite consistent with those of other studies and analyses that have examined this exposure range.

4.3. Summary. In summary, analysis of the 1950–1979 US lung cancer mortality data for US counties that were solely dependent on groundwater for their drinking water sources found no association between lung cancer mortality and median groundwater arsenic level over the exposure range of 3 to 59 $\mu$g/L arsenic. Almost all of the dose-response slopes in both the simple and multiple linear regression models were negative, and all were statistically indistinguishable from zero. These US county lung cancer mortality data do not demonstrate an increase in lung cancer risk with respect to median groundwater arsenic levels over the exposure range of 3–59 $\mu$g/L arsenic. The upper-bound estimates of the risks, examined in a variety of models, were lower than the risks that had been predicted from the SW Taiwan data and do not support those predictions.

Disclosure

ARIES had no role in the design, collection, analyses, and interpretation of data, in the writing of the paper, and in the decision to publish the results. The analyses and interpretations are solely those of the authors and not those of either Virginia Tech or ARIES, an industrial affiliates program at Virginia Tech supported by members including companies in the energy sector. This paper was presented in part at the 2014 Society of Toxicology Annual Meeting.

Competing Interests

The authors declare that they have no conflict of interests regarding the publication of this paper.

Authors’ Contributions

Steven H. Lamm and Arnold Engel conceived and designed the analysis; Hamid Ferdosi, Nana Afari-Dwamena, and Elisabeth K. Dissen conducted data acquisition; Hamid Ferdosi, Nana Afari-Dwamena, Ji Li, Rusan Chen, Manning Feinleib, and Steven H. Lamm conducted the data analyses; and Hamid Ferdosi and Steven H. Lamm wrote the paper.

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