

Using Federal Environmental Data for Exposure Assessment in Epidemiologic Studies of Cancer

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Geospatial Statistics, Tools, Data,
Practices, Opportunities and Challenges
in the Federal Agencies
Geospatial Interest Group of the Federal
Committee on Statistical Methodology

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Linkages to environmental data – NCI studies of cancer etiology

- **U.S. Census data (e.g. income, education, housing, population density)**
- **Land use data (e.g. roads/traffic, agricultural fields [pesticides])**
- **Environmental monitoring data:**
 - ❖ **Drinking water contaminants (public water supplies)**
 - ❖ **Modeled levels in private wells**
 - ❖ **Industrial emissions (Toxic Release Inventory, Dioxin Emission databases)**
 - ❖ **Air pollutants (e.g. PM_{2.5})**
 - ❖ **Ultraviolet light**

Using Geographic Information Systems for exposure assessment

- Mapping the study population, exposure sources, and exposure assessment (fate and transport modeling)

Nuckols JR et al., *Environ Health Perspect*; 2004

- Issues/Examples:

- ❖ Accuracy of locations (geocoding)
- ❖ Agricultural pesticides and emissions from animal feeding operations
- ❖ Residential mobility
- ❖ Drinking water contaminants
 - Public water supply monitoring data
 - Private wells – modeled estimates

Locate the study population (and exposure sources)

- **Global Positioning System (GPS)**
 - ❖ High accuracy (m)
 - ❖ Easily added to home visit
 - ❖ Field studies can track individual activity patterns (e.g. commuting)
 - ❖ Not always feasible especially for large cohort studies
- **Geocode current and past addresses**



NCI-SEER NHL case-control study

- **Aim: To identify potential environmental causes of NHL**
- **Study design:**
 - ❖ **1321 cases (diagnosed 1998-2000), 1057 controls**
 - ❖ **SEER cancer registries: Detroit, Seattle, Los Angeles County, State of Iowa**
 - ❖ **Age at diagnosis: 20 – 74**
 - ❖ **Home visit, questionnaire:**
 - **Residential History**
 - **House dust samples**
 - **Blood samples**
- **Exposure Period: lifetime history (1923 - 2000)**

Study area and GPS locations of current homes in the NCI-SEER NHL case-control study



Is geocoding accurate enough?

- **We compared geocoded addresses to GPS measurements at home interview**
- **Calculated the positional accuracy for residences located inside and outside town boundaries (rural) in Iowa**

Positional accuracy (m) by location of home (rural, in town)

	Commercial firm		Geocoding in ArcGIS	
	<u>Town (n=159)</u>	<u>Rural (n=56)</u>	<u>Town (n=152)</u>	<u>Rural (n=53)</u>
Median	50	212	56	88
(IQR)	(28-83)	(89-747)	(36-92)	(44-254)
p-value	<0.0001		0.0013	

- Rural addresses had greater errors
- Town size did not affect the positional accuracy for 'urban' addresses by either method

Agricultural Health Study

- **Prospective cohort of pesticide applicators and their spouses in IA and NC in 1993-1996; follow-up interviews in 2000-3 & 2007-10**
- **~90,000 farmer/pesticide applicators and spouses**
- **>150,000 addresses including past homes from short residential history**
- **~66% of homes are rural**
- **Compared rooftop locations (digital orthophotos), E911 locations, and geocoded addresses**

Distance between the E911 address location (blue) and the roof top location (red)



Orthophoto is 2 feet (0.6 m) resolution

Positional error by geo-location method

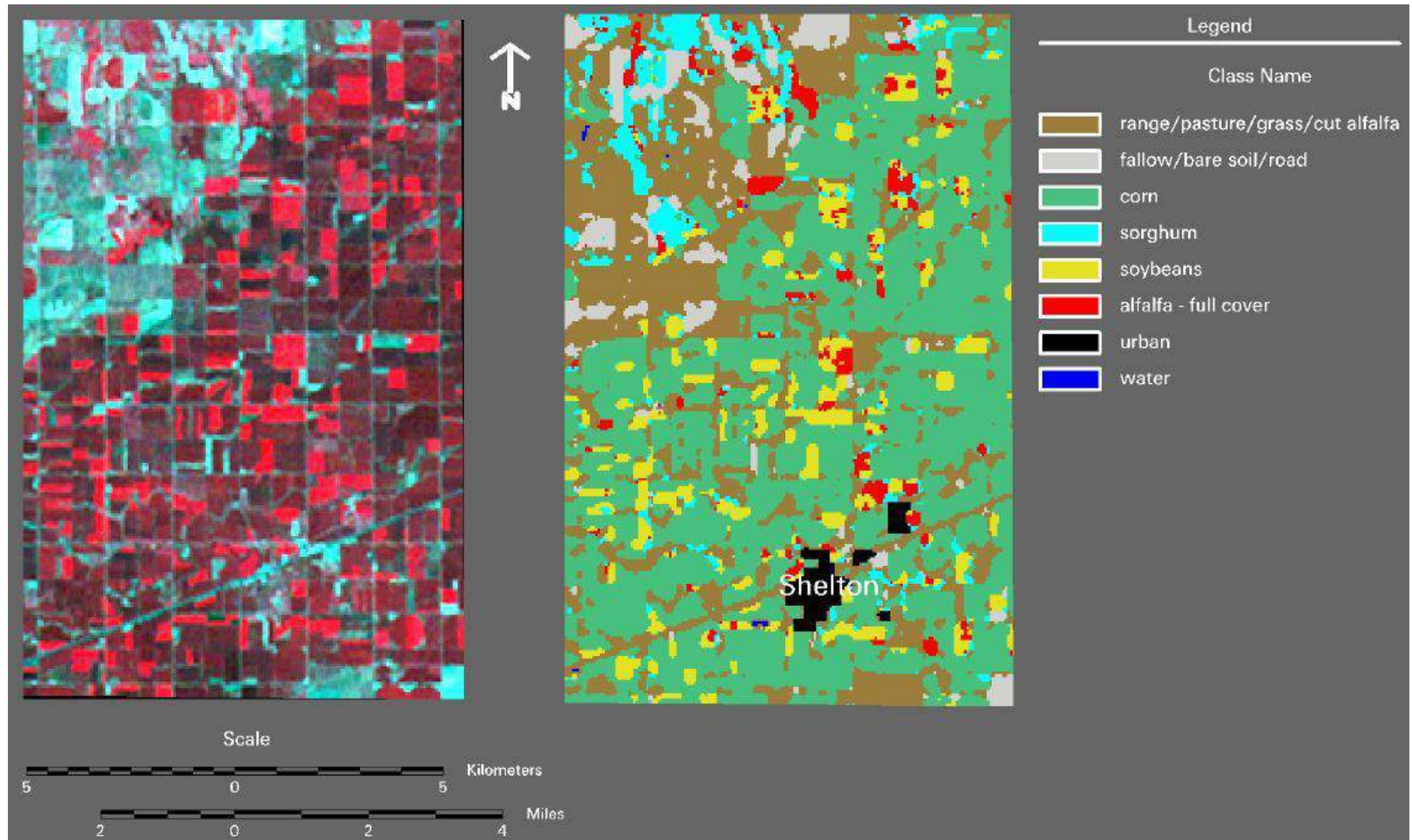
Comparison	Median (meters)	Interquartile range (m)
Overall:		
Address-match vs. Rooftop	90	47-215
E911 vs. Rooftop	39	22-61
Rural:		
Address-match vs. Rooftop	147	78-353
E911 vs. Rooftop	51	39-83
In-town:		
Address-match vs. Rooftop	45	27-68
E911 vs. Rooftop	19	17-23

Jones RR et al., *Int J Health Geographics*; 2014

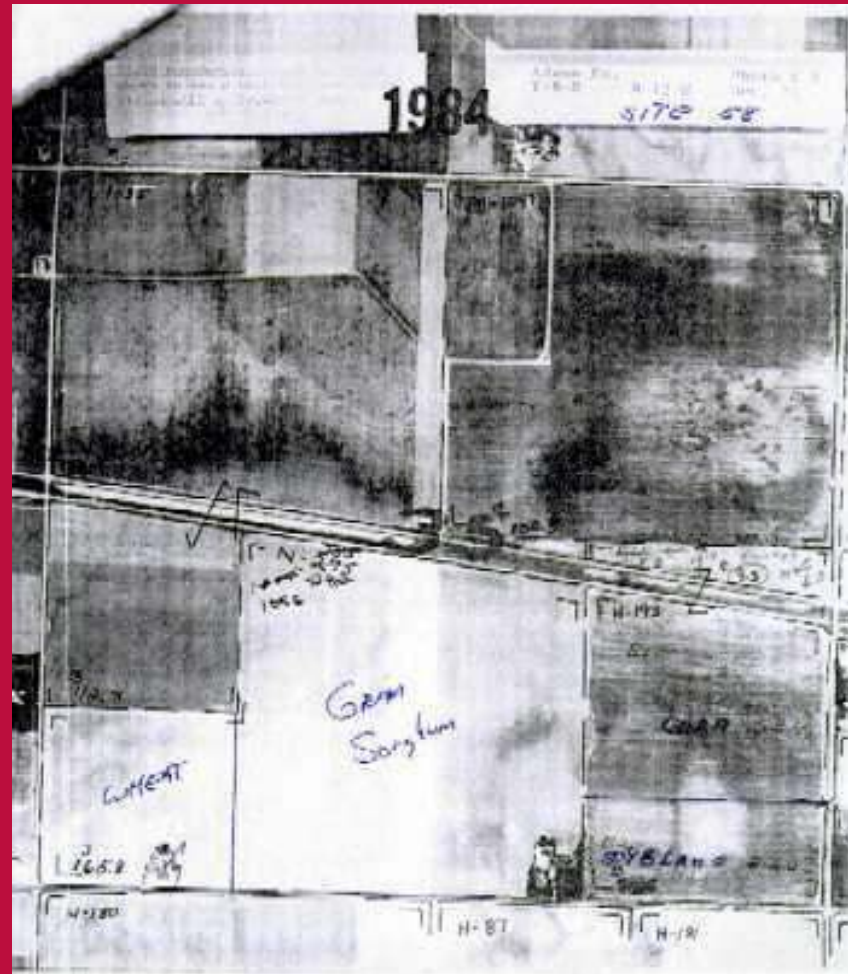
Estimating residential exposure to agricultural pesticides – NCI-SEER NHL study



Historical NASA Landsat imagery can be used to create crop maps

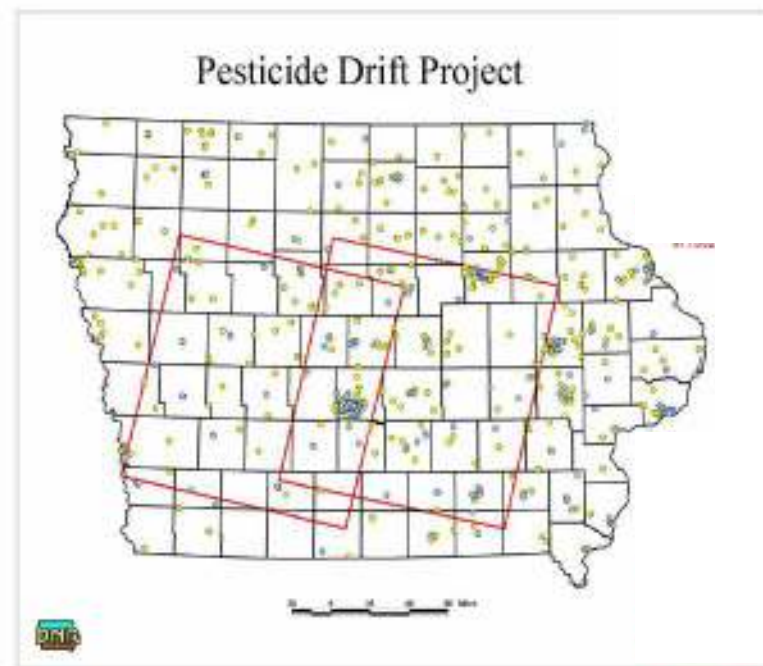


Farm Service Agency has historical aerial photographs with locations of crops



Estimating agricultural pesticides: NCI-SEER NHL case-control study

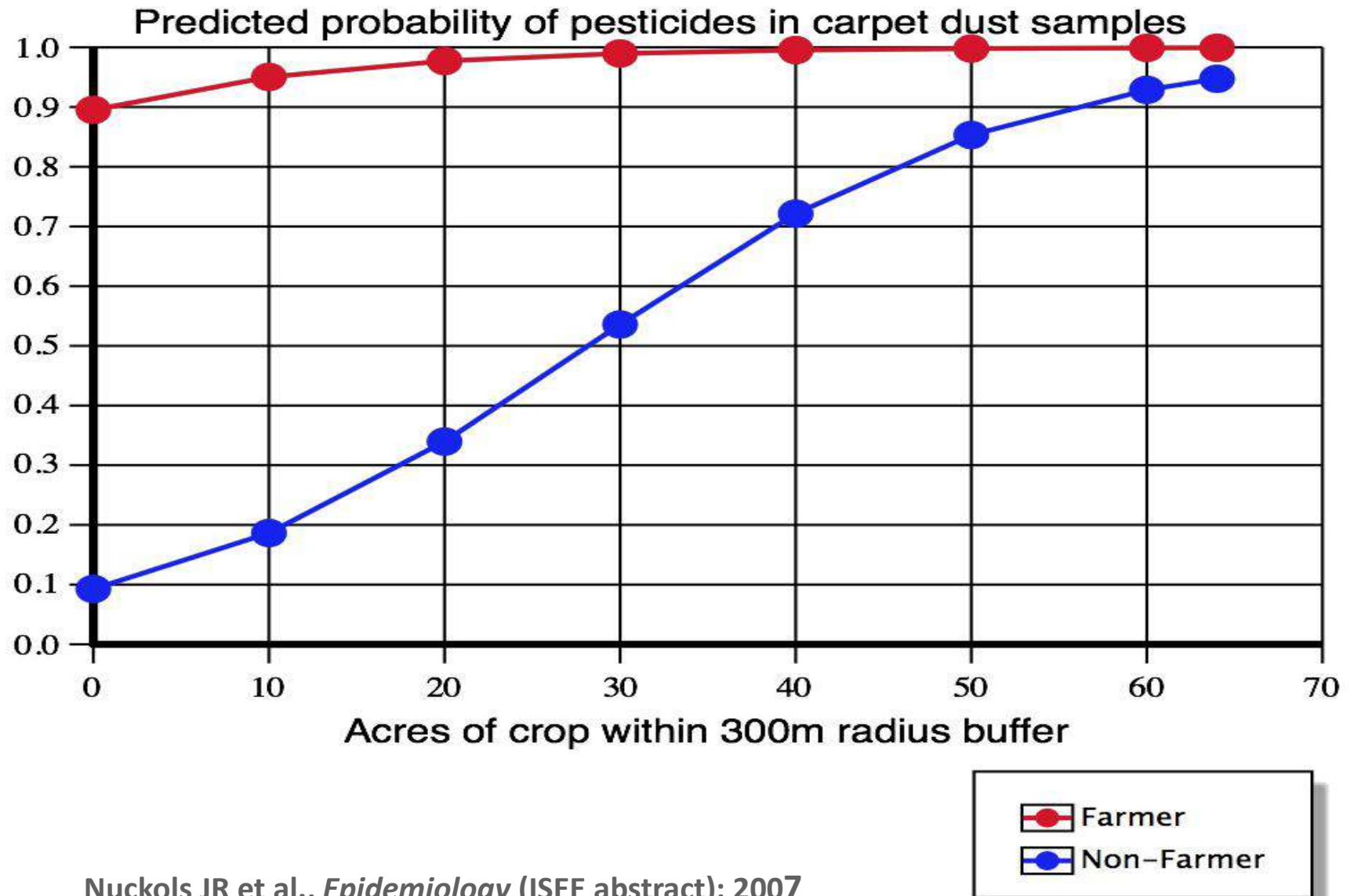
- **Satellite imagery used for crop maps**
 - 1998-2000
- **Dust samples**
- **14 agricultural herbicides**



Iowa population with agricultural crops within various buffer distances of residence

Buffer (meters)	All residences	Within towns
100	29%	18%
250	44%	38%
500	60%	52%

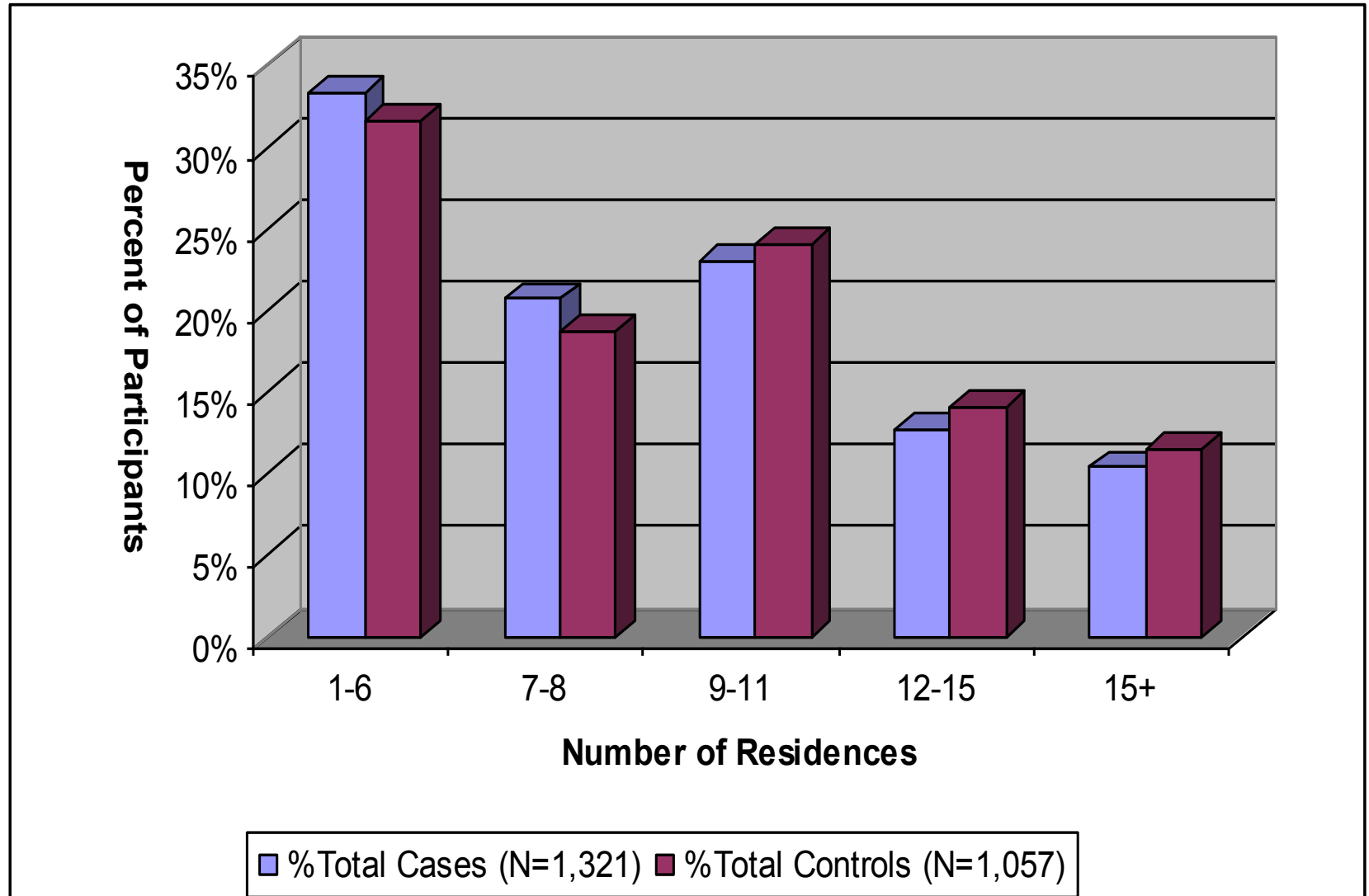
Probability of detecting agricultural herbicides in homes of farmers (red) and nonfarmers (blue)



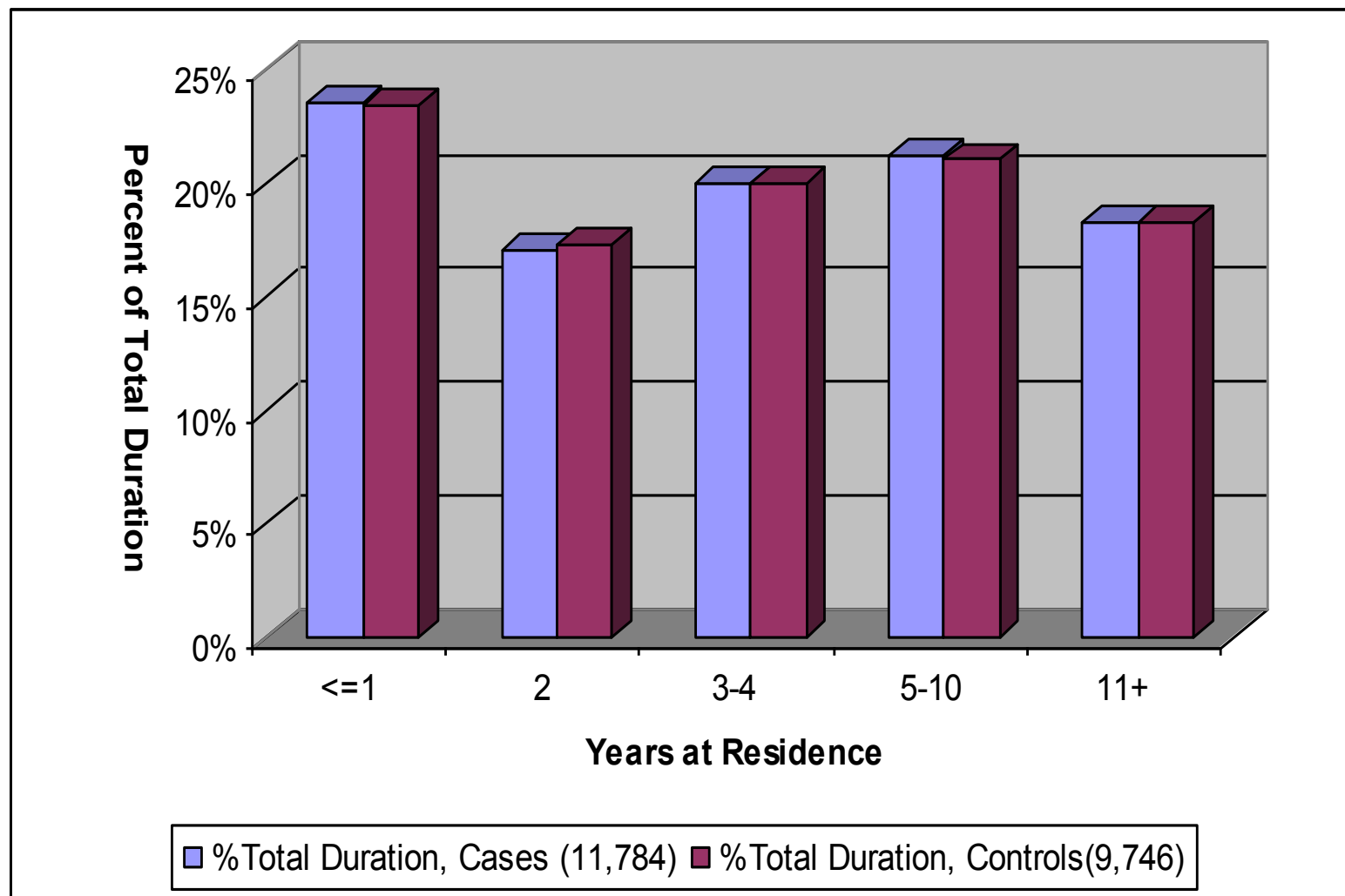
NCI-SEER NHL Study: Current and past homes



NHL Number of Residences



NHL Duration at each Residence



DIOXIN EMITTING FACILITIES

EPA INVENTORY, 1987 and 1995



EPA: An inventory of sources and environmental releases of dioxin-like compounds in the United States for the years 1987, 1995, and 2000. U.S. Environmental Protection Agency; 2006.

Original and Verified Facility and Residence





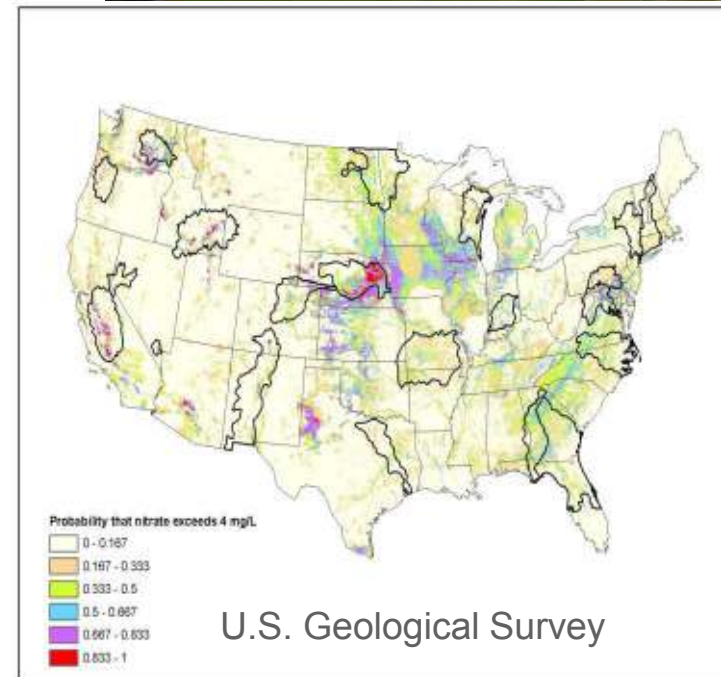
1,500 meters

Distance between EPA Facility Geocode and Verified Location (Km)

	Cement Kilns	Coal Power Plants	Hazard Waste Incinerator	Medical Waste	Municip. Waste	Sewage Sludge incinerator
25th	1.2	0.05	4.4	0.0	3.2	1.0
Median	4.0	0.12	11.5	0.0	7.8	4.6
75th	6.7	0.45	32.8	2.7	29.0	23.4
Mean	7.0	0.93	23.5	48.7	23.1	13.8

Nitrate in drinking water: Sources and exposures

- Nitrogen fertilizers, animal and human waste
- Maximum contaminant level: 10 mg/L as $\text{NO}_3\text{-N}$
- Highest exposures: private well users
- Measurements are sparse

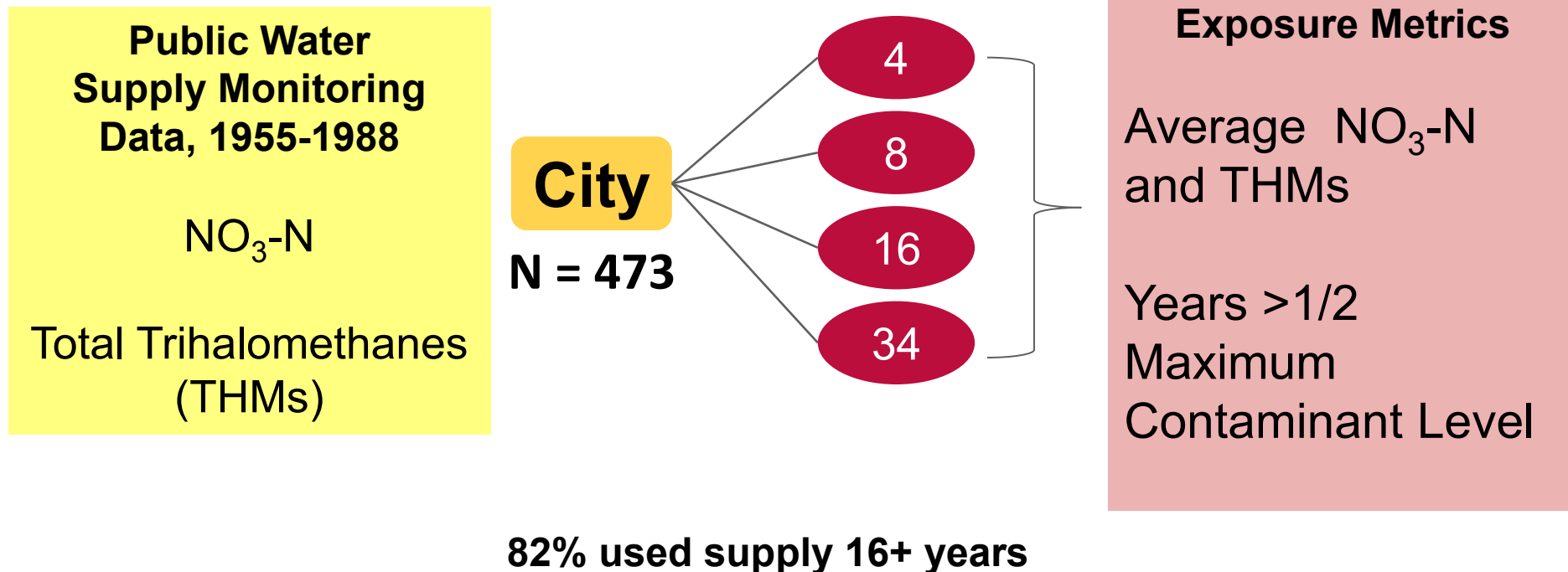


Drinking water nitrate and cancer in two cohorts in agricultural areas



- **Iowa Women's Health Study (IWHS):**
 - 42,000 postmenopausal women
 - Drinking water source and duration in 1989
 - 73% use public supplies, 25% private wells
 - Many surface water supplies
- **Agricultural Health Study (AHS):**
 - 60% use private wells

Iowa Women's Health Study: Public water supply exposure assessment



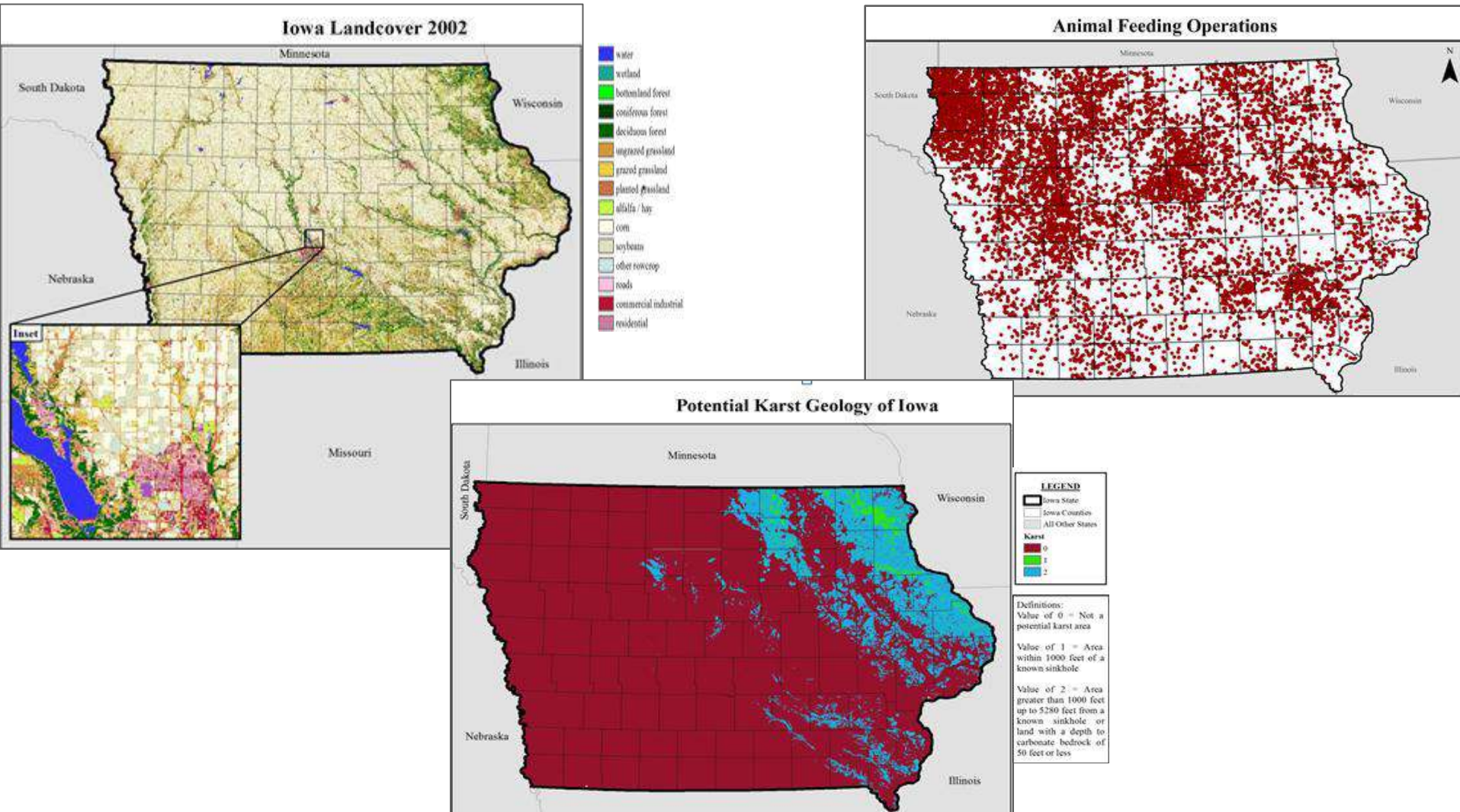
Ward MH et al., *Epidemiology*; 2010

Inoue-Choi M et al., *Int J Cancer*; 2014

Jones RJ et al., *Environ Health Perspect*; in press

GIS-based model of nitrate in private wells

- ~34,000 nitrate measurements (1980-2000s)
- Evaluated >150 variables (e.g., land use, animal feeding operations, geology, soils)



Random forest model performed best

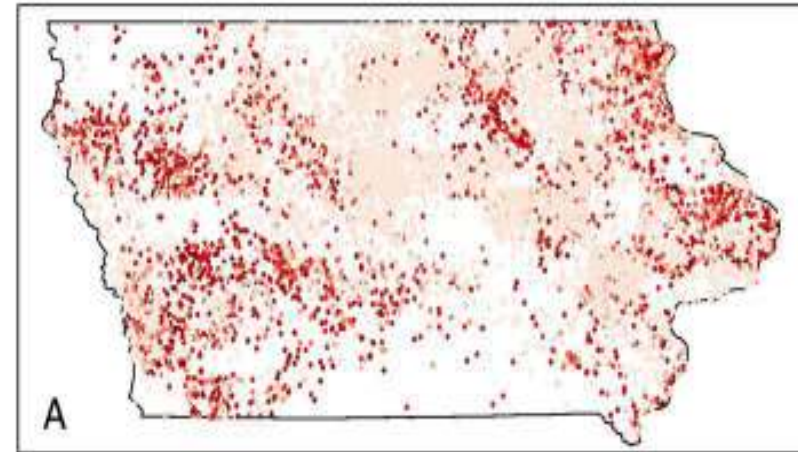
-66 variables explained 77% of variation in training dataset:

- ❖ **Well depth**
- ❖ **Geologic features – karst geology, sinkholes**
- ❖ **Slope, elevation**
- ❖ **Animal feeding operations**
- ❖ **Agricultural land (1990)**
- ❖ **Precipitation**
- ❖ **Soil characteristics at well screen**
- ❖ **Year**

Sensitivity and Specificity (5 mg/L)

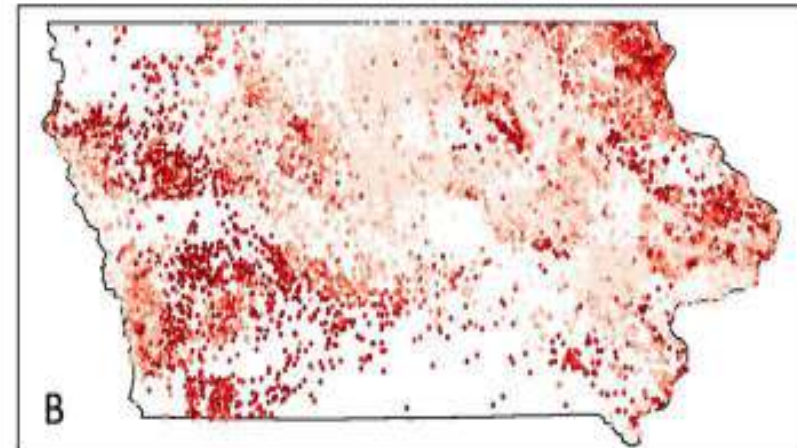
		<u>NO₃-N Observed</u>	
		≥5 mg/L	<5 mg/L
NO ₃ -N Predicted	≥5 mg/L	Sensitivity 2615 (67%)	2598 (14%)
	<5 mg/L	1280 (33%)	Specificity 15660 (86%)

Observed Nitrate in Testing Dataset



[0,1]
 (1,2]
 (2,3]
 (3,4]
 (4,5]
 (5,10]
 (10,267]

Predicted Nitrate in Testing Dataset



GIS for exposure assessment - summary

- **Assess exposures not easily obtained by questionnaires or biomonitoring**
- **Need to assess and quantify uncertainty in spatial data**
- **Validation of GIS-based exposure metrics for assessing individual exposure**
- **Include activity patterns to refine exposure assessment**

Nuckols JR et al, *Environ Health Perspect*; 2004

Ward MH and Wartenberg D, *Am J Epidemiol*; 2006

GIS for improving exposure assessment in cancer studies

- Will be increasingly useful in future - data availability, improved technology for satellite imagery, geocoding
- Requires an interdisciplinary approach:
 - ❖ Geographers, environmental engineers, chemists, environmental scientists, epidemiologists

Nuckols JR et al, *Environ Health Perspect*; 2004

Ward MH and Wartenberg D, *Am J Epidemiol*; 2006

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