

Using Geographic Information System to Identify Lyme Disease Risk Components

> Wayne Frad GEOG 596A Capstone Proposal Penn State MGIS Program

Advisor: Dr. Alexis R. Santos

# Agenda

- Application of GIS in Epidemiology
- Lyme disease Facts
- Objective
- Study Area
- Sources & Methods
- Data Analysis Cluster Analysis
- Regression Models
- Analysis of Results
- Discussion of Application
- Lyme Disease Issues and Facts
- References
- Question and Comments

### Practical Application of GIS in Epidemiology



Historical Examples that Location Matters

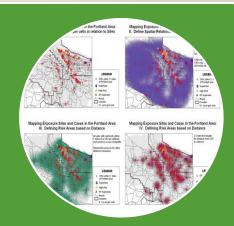
- Hippocrates 3<sup>rd</sup> century BC physicians observed disease occurred some places and not in others
- 1854 Dr. John Snow used geospatial information to analyze cholera deaths and found clustering around water pumps in London



Spatial Data Management



#### Visualization



#### Spatial Analysis

- Overlaying
- Buffer Analysis
- Location-allocation Analysis
- Exploratory Spatial Analysis
- Spatial Statistical Modeling
- Spatial Interaction Model
- Spatial Diffusion Models

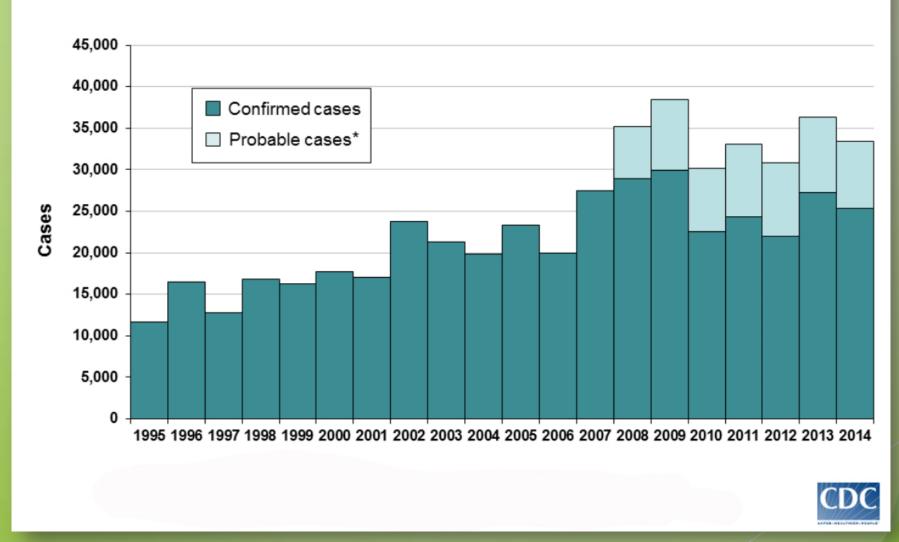
## Why Worry About Lyme disease?

- Lyme disease caused by Borrelia burgdorferi is the most prevalent vector-borne disease in the United States 240-300 thousand new cases a year.
- First discovered by Dr. Alan Steere in 1977.
- Spread to humans by Ixodes scapularis (deer tick or western blacklegged tick).
- Ticks get the bacterial species from the skin and blood of hosts such as White-tailed deer and other small mammals.
- Symptoms include a bull's-eye rash, fever, chills, headache, fatigue and joint pain.
- Lyme disease costs the US health care system between \$712 million to 1.3 billion a year (Johns Hopkins School of Public Health, 2015).
  - Long Term effect can lead to neurological diseases, meningitis, Bell's palsy, heart problems and arthritis.



#### Confirmed Cases of Lyme disease in the United States 1995-2014

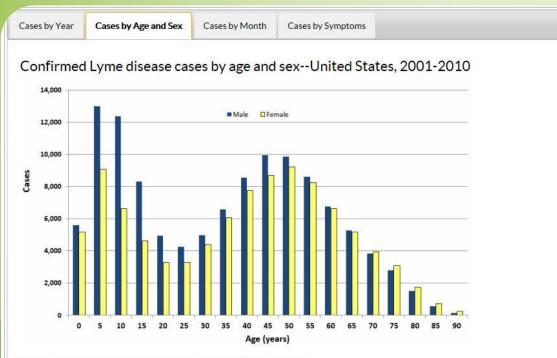
#### Reported Cases of Lyme Disease by Year, United States, 1995-2014



Source: Centers for Disease Control and Prevention http://www.cdc.gov/lyme/stats/index.html

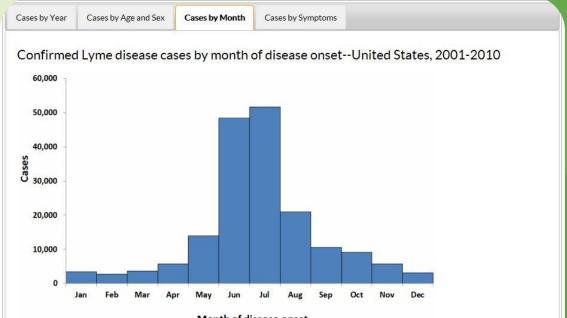
### Lyme Disease Facts

# Commonly infects boys Age 5-9 years



Reported cases of Lyme disease are most common among boys aged 5-9.

# Incidence is higher between May and August



#### Month of disease onset

Lyme disease patients are most likely to have illness onset in June, July, or August and less likely to have illness onset from December through March.

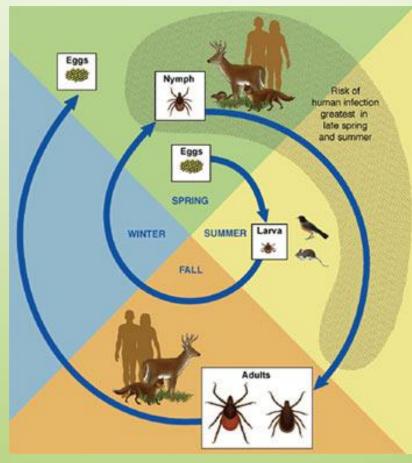
Sources: Centers for Disease Control and Prevention http://www.cdc.gov/lyme/stats/index.html

Lyme disease patients are most in eight to have illness onset in June, July, or August and less likely to have illness onset from December through

Month of disease onset

## Objective

- To Compare differences in Lyme disease cases by county in a ten year period.
- To study environmental and population factors associated with Lyme disease incidence



#### Environment

- Climate
- Temperature
- Soil
- Ecosystem (Forest Canopy)

#### **Rural Housing**

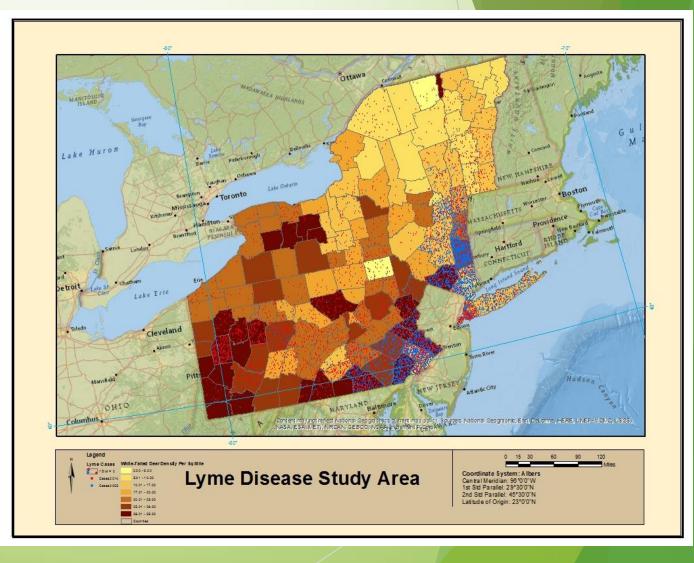
- New Housing more Rural Areas
- Interaction Forest Edges

#### **Host Population**

• Mammal Migration Patterns

# Study Area

- Tristate region of New York, Vermont and Pennsylvania consisting of 143 counties
- County level analysis
- CDC Data uses home address. The assumption made that most people are near home when infected.
- States chosen have high rates of infection and have similar ecosystems lend itself to spatial observation.
- Data was over 2012-2014 Period Incidence rates.



#### **Data Sources**



CENTERS FOR DISEASE CONTROL AND PREVENTION

Raw Count Lyme disease cases





Rural Housing and Metro Communities



Soils, Climate and Temperature Data



Population and County Data

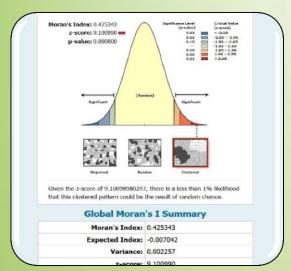


Deer Density Migration Data



Statistical Analyst and Maps

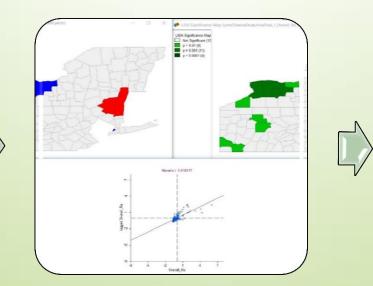
### **Spatial Analytical Methods**



#### Cluster Analysis

(Spatial Auto-Correlation)

- Gets Indication of Lyme disease distribution over region.
- Are Lyme disease cases are randomly distributed or is clustering observed?



Local Indicators of Spatial Association (LISA)

Analyze study area for cold or hot areas of activity

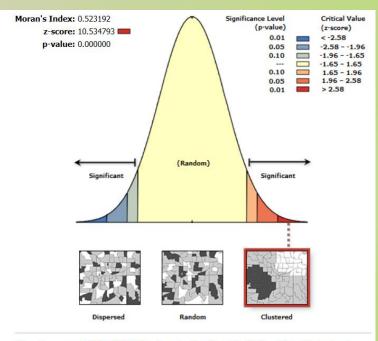
- Determine relationship of points and vector polygons (County)
- High Z Score +Small P = Hot Spot
- Low Negative Z Score + Small P Value = Cold Spot

SUMMARY OF OU	TPUT: ORDINARY I : LymeD:	LEAST SQUARES E	STIMATION	
Dependent Var	iable : Raw_Co	nuste Number o	f Observations	. 143
fenn denendent	t var : 69.	.5853 Number o	f Variables	4
.D. dependent	t var : 100	7.873 Degrees	of Freedom	: 139
berguared	: 0.20 sared : 0.10 esidual:1.328944 : 950 ssion : 97. ML : 925 sion ML: 96.	01372 F-stotis	tic	: 11.6920
idjusted R-sq	sared : 0.18	84135 Prob(F-s	tatistic)	:7.11992e-D07
Sum squared re	esidual:1.32894	e+006 Log like	lihood	: -856.207
igna-square	: 956	50.69 Aksike 1	afo criterion	: 1720.41
.E. of regre	ssion : 97.	.7788 Schwarz	criterion	: 1732.27
E of rearest	L : 923	4015		
ric or regree		. 40.15		
Variable	Coefficient	Std.Error	t-Statistic	Probability
CONSTANT	-1197,565	452 2016	-2.647772	0.00904
PRECIP ANNI	8.585092	2 326443	3.690222	0.00032
THIN ANN A	8.585092 12.07181	2,981198	4,049315	0.00008
ECOZONE	7.462812	6.105108	1,222388	0.22363
TEST ON NORMAL	RITY CONDITION N LITY OF ERRORS DF	VALUE	PROB	
Jarque-Bera	2	599.3597	0.00	000
AGNOSTICS F				
TEST	DF	VALUE	PROB	
Breusch-Pagan	test 3 tt test 3	33.6080	0.00	
Coenker-Basse	tt test 3	6.4254	0.09	
		SD OF REPORT		

#### Regression Analysis (OLS + GWR)

- Effects of Multiple Independent Variables on Dependent Variable
- Defines Strength of relationship and predictive value
- Look at variables related to environment, housing and host white tailed deer populations relating to dependent variable of Lyme disease cases

# Cluster Analysis Results Incidences Lyme 2012-2014 Tri State NE Study Area



Given the z-score of 10.5347929065, there is a less than 1% likelihood that this clustered pattern could be the result of random chance.

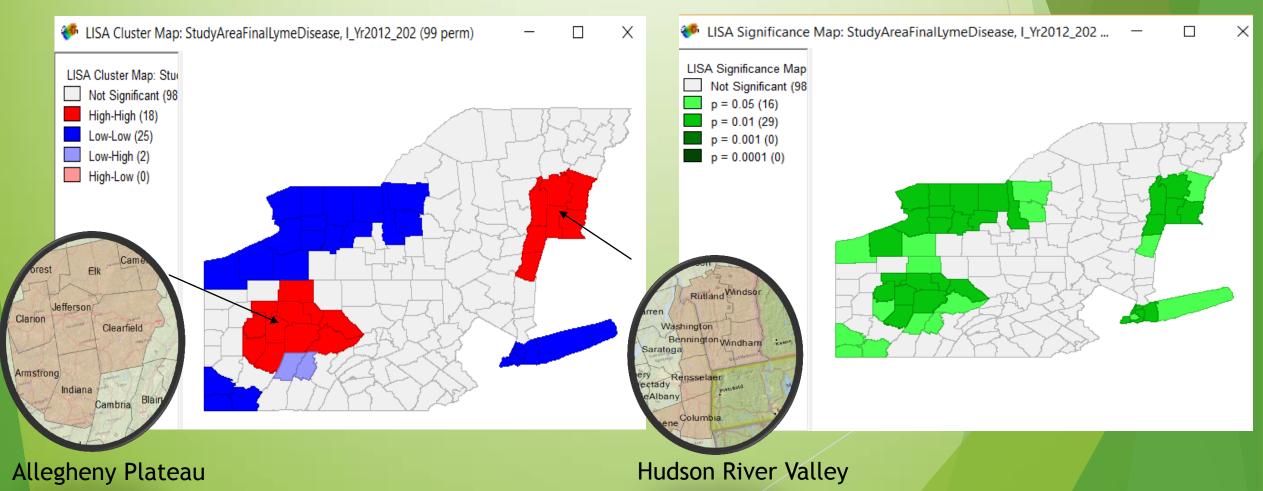
Global Moran	<b>Global Moran's I Summary</b>			
Moran's Index:	0.523192			
Expected Index:	-0.007042			
Variance:	0.002533			
z-score:	10.534793			
p-value:	0.000000			

County Level Rates.

- Method Euclidian Distance.
- Period Incidence Rates Average 2012-2014.
- Shows areas higher case counts (Clusters) that share similarity.
- Starts investigation for factors that may be creating these significant events.

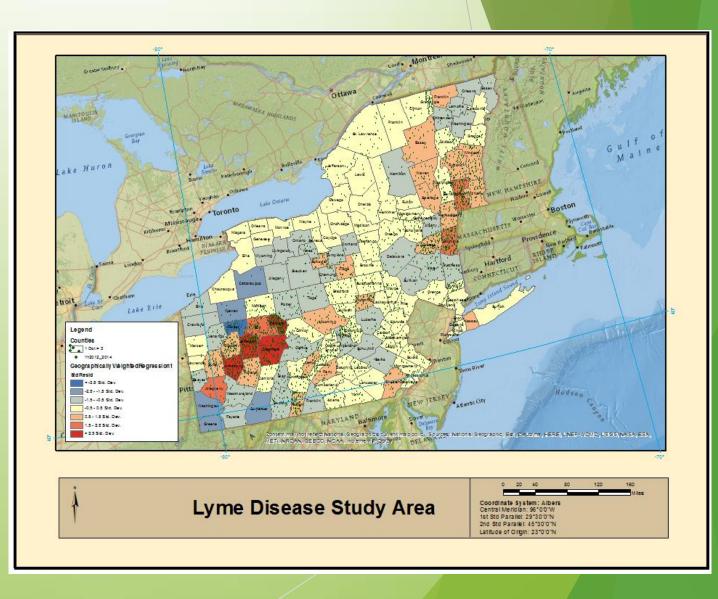
### Local Indicators of Spatial Association Analysis

- Evaluate areas of high and low density clustering.
- Conduct Hot Spot analysis to define areas of significance.

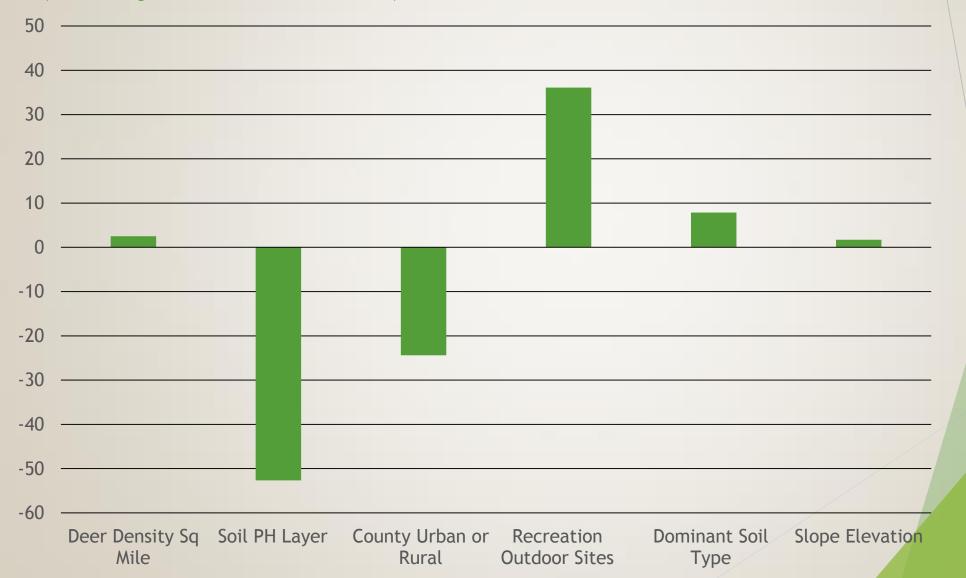


### **Regression Analysis**

- Urban or Rural County
- White-tailed Deer Densities
- Canopy Cover % using NDVI data
- Temperature
- Precipitation
- Relative Humidity
- Soil Analysis
- Slope/Elevation
- Housing Construction
- Watershed Percentage
- Recreation



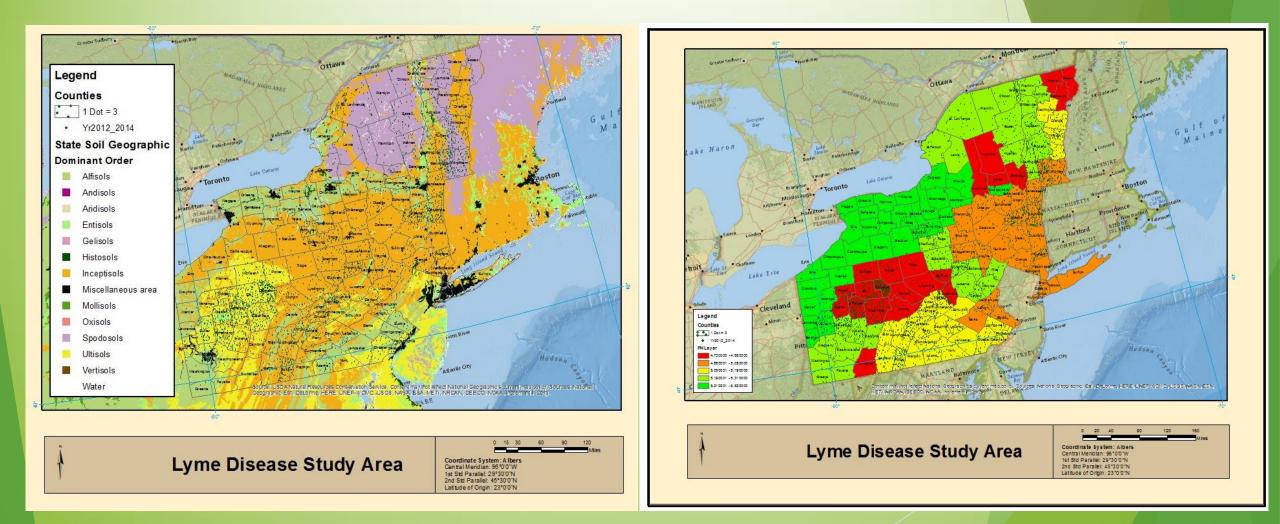
## OLS Regression Coefficents (R-Square = 0.41)



#### Geographically Weighted Regression Model (R-Squared 0.61)

- Deer Density was associated with higher incidence of Lyme disease
- Metropolitan Counties have lower incidence of Lyme disease
- PH of Soil higher acidity was marginally associated with lower incidence
- Spatial Component of the model capture a significant effect

## **Regression Analysis Soil Habitation**

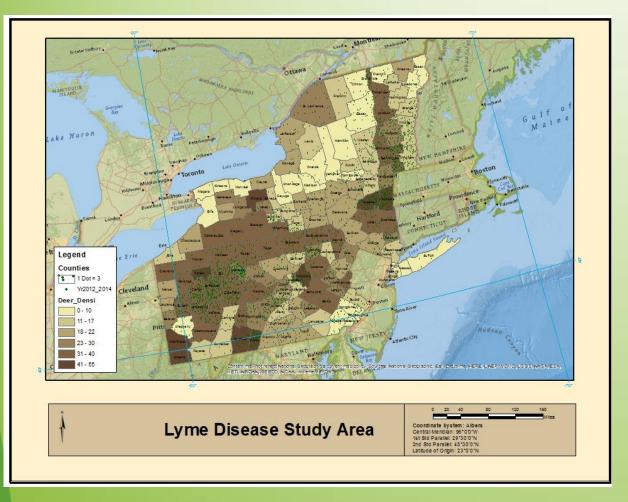


Sandy Loom Soils Ultisols & Inceptisols

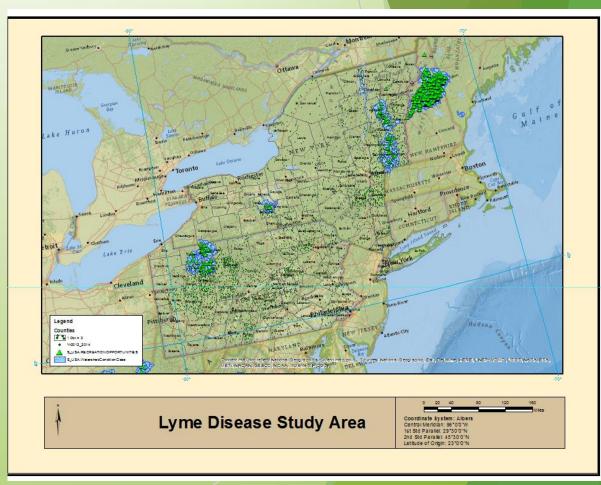
Low Acidity of Soil for Tick Populations Thrive

#### Regression Analysis Tick Host & Recreation

Deer Density Per Square Mile



#### Location of Park & Recreation and Watershed Sites



#### Analysis of Results

- Environmental and Human Habitat variables found to be Significant
  - Deer Density
  - Soil Composition
  - Recreational Opportunity
  - Rural County

What can be with statistically significant factors?

- Use models to map and identify future risk areas.
- Use Results to recommend warning zones to the public and public health agencies.

# **Discussion of Application**

- Create web applications that outline risk areas that tie to hiking trails applications
- Create Signs in High Danger areas for tick infestation
- Zoning for housing that create rural neighborhoods in areas that put humans at risk for infections
- Use counter measures such as fungus that kill ticks or control ticks on deer populations
- Lyme disease vaccines or bait vaccinations of rodents
- Increase resources and facilities that treat Lyme disease now very few resources available for size of the epidemic







### **Treatment Costs and Lack of Resources**

- Small Numbers of physicians diagnose and treat Lyme disease (Fear of sanctions by medical boards decrease those practice while those do treat Lyme are swamped and cannot accept new patients)
- 285 primary care physicians surveyed 2% treat Lyme and 50% don't believe chronic infection of Borrelia burgdorferi exists (MedPage Today, 2010)
- Disparity in spending gap for prevention measures for mosquitoborne and tick not related to actual cases
- Lack of agreement for standardized Lyme treatments with antibiotics
- New Laws in New York by Governor Cuomo (2015) offer hope Lyme Doctor Protection Act give medical providers the ability try alternative and new methods or use long term antibiotic regiments

<b>HIV/AIDS</b> \$3 billion 50,000 cases	<b>WEST NILE VIRUS</b> \$48 million 2,100 cases
<b>\$60,000</b> per case	<b>\$22,857</b> per case
BREAST CANCER	LYME DISEASE
\$704 million	\$21 million
232,000 cases	300,000 cases
<b>\$3,034</b> per case	<b>\$70</b> per case



NEW LYME DISEASE CASES IN US				
CASES PER MONTH	CASES PER WEEK			
<b>25,000</b> CDC ESTIMATE	<b>5,770</b> CDC ESTIMATE			
CASES PER DAY	CASES PER HOUR			
822 CDC ESTIMATE	<b>34</b> CDC ESTIMATE			
<b>NO ACCURATE TESTS</b>	THERE ARE NO TESTS AVAILABLE TO PROVE That the organism is eradicated or That the patient is cured.			



#### FEWER THAN 50% OF PATIENTS WITH LYME DISEASE RECALL A TICK BITE.



### THE ELISA SCREENING TEST IS UNRELIABLE.

The common Elisa test you receive at your doctor's office misses 35% of culture proven Lyme disease. Some studies indicate up to 50% of the patients tested for Lyme disease receive false negative results.



**50%** 

#### UP TO FIFTY PERCENT OF TICKS IN Lyme-endemic areas are infected.

FEWER THAN 50% OF PATIENTS

RASH.

WITH LYME DISEASE RECALL ANY

The onset of Lyme disease symptoms can be easily mistaken for other illnesses. Once symptoms are more evident the disease may have already entered the central nervous system, and could be hard to cure.

# References

- Becker, Levin Arielle. (2010) Few state physicians treat chronic Lyme disease, survey says, The CT Mirror, Retrieved June 20, 2016 <a href="http://ctmirror.org/2010/09/17/few-state-physicians-treat-chronic-lyme-disease-survey-says.html">http://ctmirror.org/2010/09/17/few-state-physicians-treat-chronic-lyme-disease-survey-says.html</a>
- Brownstein, J., et al. (2003) A Climate-Based Model Predicts the Spatial Distribution of the Lyme Disease Vectors Ixodes scapularis in the United States, *Environmental Health Perspectives* Vol 111 Number 9 July 2003. Retrieved February 12, 2016 <u>http://www.ncbi.nlm.nih.gov/pubmed/12842766</u>
- Centers for Disease Control and Prevention (CDC) (2016) Retrieved March 6, 2016
   <u>http://www.cdc.gov/lyme/stats/index.html</u>
- Cawley, M. (2010) The Incidence of Lyme Disease in Southeastern Pennsylvania Retrieved on February 22, 2016 at <a href="http://www.goglobalgis.com/uploads/1/3/7/7/13770996/the\_incidence\_of\_lyme\_disease\_in\_se\_pa.pdf">http://www.goglobalgis.com/uploads/1/3/7/7/13770996/the\_incidence\_of\_lyme\_disease\_in\_se\_pa.pdf</a>
- D Chen, H Wong, P Belanger, K Moore (2015) Analyzing the Correlation between Deer Habitat and the Component of the Risk for Lyme Disease in Eastern Ontario, Canada: A GIS-Based Approach. - ... International Journal of Medicine, -<u>http://www.mdpi.com/2220-9964/4/1/105/htm</u>
- Department of Natural Resources (2016) Retrieved February 20, 2016 at <a href="http://www.the-whitetail-deer.com/StateFishWildlifeConservationLinks.html">http://www.the-whitetail-deer.com/StateFishWildlifeConservationLinks.html</a>
- Estrada-Pena, A. (2002) Increasing habitat suitability in the United States for the tick that transmits Lyme disease: A remote sensing approach. *Environ. Health Perspect.* 2002, 110, 635–640. <a href="http://www.ncbi.nlm.nih.gov/pmc/articles/PMC1240908/">http://www.ncbi.nlm.nih.gov/pmc/articles/PMC1240908/</a>
- Guilford, Gwynn. (2015) Stop Blaming the Deer, Lyme disease is spreading faster than ever and humans are partly to blame, Retrieved July 1, 2016 from <a href="http://qz.com/441583/lyme-disease-is-spreading-faster-than-ever-and-humans-are-partly-to-blame/">http://qz.com/441583/lyme-disease-is-spreading-faster-than-ever-and-humans-are-partly-toblame/</a>

### References

- Glass, et al. (1995) Environmental Risk Factors for Lyme Disease Identified with Geographic Information Systems. American Journal of Public Health July 1995 Vol. 85 No 7. Retrieved May 23, 2016 from <a href="http://www.ncbi.nlm.nih.gov/pubmed/7604918">http://www.ncbi.nlm.nih.gov/pubmed/7604918</a>
- Koryos, 2014 White-Tailed Deer Overpopulation in the United States <u>http://www.koryoswrites.com/nonfiction/white-tailed-deer-overpopulation-in-the-united-states/</u>
- Singh, Vinti March 3, 2012. Fungus kills Lyme disease-carrying ticks Connecticut Post.com Retrieved July 5, 2016 <u>http://www.ctpost.com/local/article/Fungus-kills-Lyme-disease-carrying-ticks-3379407.php</u>
- Szonyi et al. 2015. Exploratory Spatial Analysis of Lyme disease in Texas-what can we learn from reported cases? *BMC Public Health* 15:924 Retrieved February 3, 2016 at <a href="http://bmcpublichealth.biomedcentral.com/articles/10.1186/s12889-015-2286-0">http://bmcpublichealth.biomedcentral.com/articles/10.1186/s12889-015-2286-0</a>
- National Oceanic and Atmospheric Administration (2016). Retrieved on March 6, 2016 <u>http://www.noaa.gov/</u>
- U.S. Department of the Interior, Fish and Wildlife Service, and U.S. Department of Commerce, U.S. Census Bureau. 2006. National Survey of Fishing, Hunting, and Wildlife-Associated Recreation.
- US Geologic Survey 2016. Retrieved on March 6, 2016
   <a href="http://www.usgs.gov/ecosystems/genetics\_genomics/epidemiology\_fish\_wildlife\_diseases\_mammals.html">http://www.usgs.gov/ecosystems/genetics\_genomics/epidemiology\_fish\_wildlife\_diseases\_mammals.html</a>
- Weisberger, Mindy. (2016) Ticks That Can Carry Lyme Disease Are Spreading Across the US. Live Science <u>http://www.livescience.com/53447-lyme-ticks-range-spreading.html</u>
- Yale School of Public Health. 2016. Epidemiology of Microbial Diseases, http://publichealth.yale.edu/emd/research/zoonosis/projects/tick.aspx

#### Acknowledgements

A great appreciation to the facility of Penn State World Campus and my advisor Dr. Justine Blanford and Dr. Alexis R. Santos for their advice and input into my capstone project.



## **Questions or Comments**

