

Open Access

# A Moran's *I* Autocorrelation and Hot Spot Analysis for Identifying and Predicting Diarrheal Disease Cases around Sixty-Seven Community Wells in West Pokot County, Kenya

# Ryan C Graydon\*, Samuel Alao and Benjamin G Jacob

Department of Global Health, College of Public Health, University of South Florida, Tampa, USA

#### Abstract

Water, sanitation, and hygiene (WASH) infrastructure is crucial to the health of every community. Globally, rural communities disproportionately lack improved drinking water and sanitation facilities compared to urban communities. West Pokot County, Kenya has a population of 512,690 people of which 91.7% live in rural areas. The Pokot people, the main people group residing in West Pokot County, depend on communal wells, rivers, and other surface water sources presenting the opportunity to consume pathogens and induce diarrheal diseases. Harvester's International works with Pokot leaders to install community wells to provide an improved drinking water alternative to surface water in order to break the diarrheal disease transmission cycle. Community health epidemiological and spatial data from 67 communities in West Pokot County were assessed using autocorrelation and hot spot analysis in GIS software to identify geographical locations of reported cases of diarrheal diseases and to predict diarrheal disease cases across the entire county. The hot spot analysis revealed five hot spots and one cold spot and predicted additional hot spots in the southwest region of the county. This map is useful to target the specific locations for public health interventions to control and eliminate diarrheal diseases in West Pokot County. Future studies should include more spatial data points to improve the validity and reliability of the prediction map.

**Keywords:** Diarrhea; Waterborne disease; Community wells; Spatial analysis; West Pokot County; Kenya; Africa

## Introduction

At the conclusion of the Millennium Development Goals in 2015, 663 million people still lacked an improved drinking water source and 2.4 billion people lacked access to an improved sanitation facility worldwide. Disparities were revealed as 8 of 10 people who lack an improved drinking water source and 7 of 10 people who lack an improve d sanitation facility live in rural areas [1]. The health effects of this lack of water, sanitation, and hygiene (WASH) infrastructure are staggering. Inadequate WASH causes a variety of diseases and disabilities including diarrheal disease from the ingestion of the minimum quantity of pathogenic organisms in drinking water. Inadequate WASH was estimated to be the cause of 842,000 diarrheal deaths globally representing 58% of diarrheal diseases in 2012 [2], which was approximately 2,300 deaths per day. Nine of 10 diarrheal deaths occur in children with the significant majority of deaths located in developing countries [3]. Persistent diarrhea among children is associated with malnutrition, cognitive impairment [4,5], and an increased risk of developing obesity later in life [6].

In many areas of rural Kenya, improved drinking water sources and improved sanitation facilities are inadequate [1]. Therefore, rural village communities depend on untreated water from communal wells, rivers, and other surface water sources to meet their needs presenting the opportunity to consume pathogens and induce disease. Geographic information system (GIS) has been used to map the spread of diseases, including diarrheal diseases, as part of surveillance and control strategies [7-10]. Unfortunately, despite endemic diarrheal diseases throughout every Kenyan county, the application of GIS technologies to assist in the control and elimination of these diseases in Kenya is sparse in published literature and has not been reported for West Pokot County. The purpose of this research is to identify the reported cases of diarrheal diseases and to predict hot spots for other cases of diarrheal diseases in West Pokot County, Kenya using spatial autocorrelation and hot spot analysis.

#### Materials and Methods

#### Study area and population

West Pokot County is located in Northwest Kenya along the Ugandan border (Figure 1), and is one of 47 counties in Kenya under the new dispensation of county governments that went into effect after the general election of March 2013 [11]. The capital of West Pokot County is Kapenguria. The geographical area is 8,418.2 km<sup>2</sup> and reported a population of 512,690 people during the 2009 census (Figure 2).

The Pokot people (Figure 3) live in West Pokot County, in neighboring Baringo County, and in the Pokot District of Eastern Karamoja Region in Uganda. They speak Pökoot, a language of the Southern Nilotic language family, which is similar to the Marakwet, Nandi, Tugen, and other tongues of the Kalenjin grouping. According to the 2009 census, there were an estimated 500,000 Pökoot speakers in West Pokot County. The Pokot's political system is governed through a graduated age system with elders given tremendous status and respect [11].

The people of West Pokot County live mostly in rural areas in much greater proportion than Kenya's average (Figure 4) [12]. The WASH

\*Corresponding author: Ryan C Graydon, Department of Global Health, College of Public Health, University of South Florida, Tampa, USA, Tel: 8139749784; E-mail: rgraydon@health.usf.edu

Received November 04, 2016; Accepted November 25, 2016; Published November 28, 2016

Citation: Graydon RC, Alao S, Jacob BG (2016) A Moran's / Autocorrelation and Hot Spot Analysis for Identifying and Predicting Diarrheal Disease Cases around Sixty-Seven Community Wells in West Pokot County, Kenya. J Remote Sensing & GIS 5: 182. doi: 10.4182/2469-4134.1000182

**Copyright:** © 2016 Graydon RC, et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Page 2 of 7

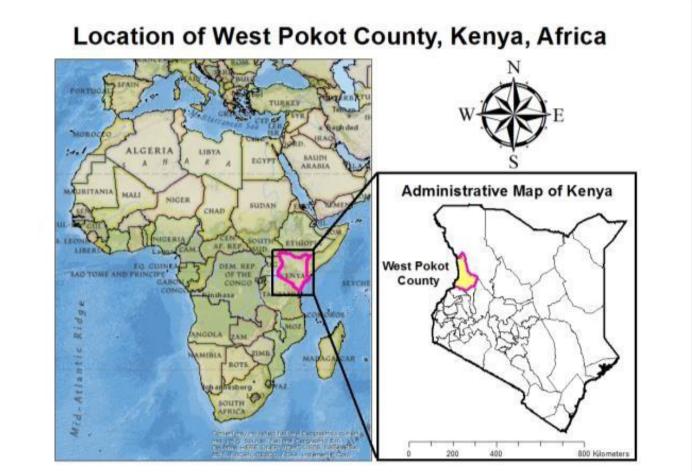


Figure 1: Location of West Pokot County, Kenya, Africa (This map represents the geographical location of the study site).

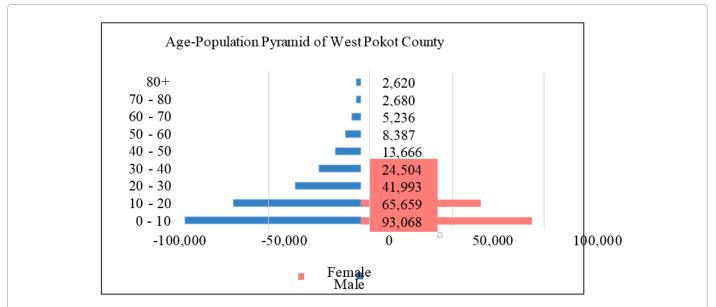


Figure 2: Age-Population Pyramid of West Pokot County (This graph presents the population and age bracket as reported by the Kenya National Bureau of Statistics from 2009 census data).



Figure 3: Pokot women walking through pastureland wearing their iconic ornate beadwork.

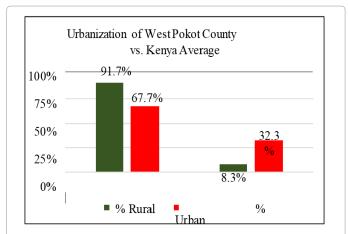


Figure 4: Urbanization of West Pokot County vs. Kenya Average (This graph presents data gathered from the 2009 census by the Kenya National Bureau of Statistics).



Figure 5: A Pokot child fills a couple jugs with water from a community well installed by Harvester's International.

infrastructure in these rural agrovillages is generally inadequate. Community wells, boreholes, and other surface water sources are commonly used (Figure 5). For sanitation, latrines are used however open defecation is still a common practice in many communities (Figure 6). Livestock (e.g., cattle and goats) are an important agricultural and economic asset of Pokot culture and often graze near human habitations and water sources (Figure 7) [13]. The close proximity of livestock to Pokot drinking water sources is a potential source of fecal contamination and enteric pathoge ns.

#### Data collection and classification of diarrheal diseases

Community data was provided by Harvester's International, a nonprofit organization based in South Carolina that works with indigenous Pokot leaders to install community wells and other development initiatives. Surveys were employed between June and September 2014 in communities where wells were installed recording well GPS coordinates and function as well as community health information including population and symptom-based disease cases. Data from 85 communities was provided of which 67 communities are in West Pokot County. Amoebiasis, cholera, dysentery, and typhoid were included in the reports and classified as diarrheal diseases for the purpose of this study.

#### Cases of diarrheal disease in West Pokot County

For children under the age of five, West Pokot County reported 14,973 cases of diarrheal diseases in 2012, which was 1.2% of Kenya's total (Table 1) [14]. From the data collected by Harvester's International in West Pokot County, 645 cases of diarrheal diseases were reported among the 249,965 residents of the 67 rural communities yielding a point prevalence of 2.58 cases per 1,000 residents (Table 2) [13].

## Analytical tools and procedures

ArcMap GIS (Esri Inc., v.10.3, Redlands, CA) was used to generate maps. Spatial autocorrelation (Global Moran's *I*) and Hot Spot Analysis (Getis-Ord Gi<sup>\*</sup>) were employed to assess level of significance of diarrheal disease cases around each community well installed by Harvester's International and to predict hot and cold spots across West Pokot County. Spatial autocorrelation was set to aggregate features within five kilometers. Hot Spot Analysis forms analysis based on case count and does not account for population or prevalence statistics.

## Results

As illustrated in Figure 8, there are five hot spots of cases of diarrhea, one spot at 99% confidence and the other four spots at 95% confidence. There is only one cold spot, which was at 90% confidence. The prediction model has a high Z-value of 2.96 concentrated in the southwest region of the county and a low Z-value of -1.56 mostly located in the south-central and northwest regions of the county.

	West Pokot County	Kenya	% of Kenya Total	
Cholera	2	95	2.10%	
Diarrhea	14,752	11,76,949	1.30%	
Dysentery	219	26,537	0.80%	
Typhoid	1,372	29,635	4.60%	
Total	14,973	12,03,581	1.20%	

 Table 1: Diarrheal Disease Cases in Patients Below Five Years of Age in 2012

 [12].

Figure 6: Pokot women sitting in a covered area with an elevated latrine to the right.



**Figure 7:** Pokot cattle grazing among community members near a river (left of frame).

# **Discussion and Conclusions**

Using epidemiological and spatial data with GIS analysis, the results illustrated in Figure 8 reveal key areas of public health interest and intervention. The hot spot analysis presents the locations where cases of diarrheal diseases are most prevalent. These locations should be given priority for control and elimination interventions to improve public health. Further assessment at each of these locations would be in order to determine the specific diarrheal disease and thus appropriate control and elimination strategies.

The prediction model illustrates the potential hot and cold spots of diarrheal disease across West Pokot County. This model appears to represent the data well as 9 of the top 10 locations of diarrheal disease cases are in red areas, which are predicted to be hot spots. However, the community of Samor, which had the sixth most diarrheal disease cases, is located in an area predicted as a cold spot. This is likely due to the relatively low number of spatial data points. In similar hot spot analyses [7,8,10], hundreds to thousands of spatial data points were used in smaller geographical areas to illustrate disease case predictions. Our data set only had 67 spatial data points in West Pokot County, which is a limitation. However, this prediction model should be used as a priority guide to assist in the decision of which communities to target next. We recommend adding future community pidemiological assessment data to this prediction model to improve its reliability and validity for future intervention decision making.

The feasibility of adding to or replicating these models in the field is high because purchasing GIS band data was not required. The base maps and GIS tools were all included in the ArcGIS software package. Therefore, it is possible for a public health agency with limited resources to be able to make these models to identify and predict disease cases to inform their control and elimination interventions.

In summary, the purpose of this research was to identify the reported cases of diarrheal diseases and to predict hot and cold spots for other cases of diarrheal diseases in West Pokot County, Kenya using GIS spatial analysis. Figure 8 illustrates both the hot and cold spot trends based on the reported cases of diarrheal diseases from Harvester's International and the prediction of the locations of other diarrheal disease cases across the entire county. However, the validity and reliability of this map may be confoundi ng due to the small number of data points to form the prediction. To improve prediction

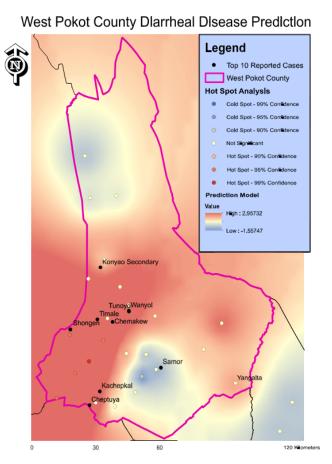


Figure 8: West Pokot County Diarrheal Disease Prediction (This map demonstrates the hot and cold spots of diarrheal disease cases and illustrates the prediction of diarrheal disease cases across the entire county. The communities with the 10 most reported cases of diarrheal diseases are also displayed).

Page 4 of 7

Page 5 of 7

Site Name	Assessment Date	Diarrhea Cases	Total People	Prevalence per 1000
Kachepkai	08-Jul-14	70	976	71.72
Shongen	24-Jun-14	46	1,500	30.67
Tunoyo	09-Jul-14	38	1,698	22.38
Konyao Secondary	26-Jun-14	30	750	40
Cheptuya	27-Aug-14	25	9,500	2.63
Samor	10-Jul-14	20	2,760	7.25
Chemakew	29-Aug-14	20	6,200	3.23
Timale	01-Sep-14	19	1,253	15.16
Yangaita	24-Jul-14	18	8,200	2.2
Wanyoi	09-Jul-14	15	4,220	3.55
Kapblakun	21-Jul-14	14	10,600	1.32
Pole Highway	23-Jul-14	12	2,000	6
Sawil	24-Jul-14	12	2,050	5.85
Kalukuna	01-Sep-14	12	2,150	5.58
Kodomuch	01-Sep-14	12	3,100	3.87
Chemulunjo	23-Jul-14	12	4,570	2.63
Kopeyon	01-Sep-14	11	560	19.64
Father Leo Staples	24-Jul-14	11	620	17.74
Kakwomeses	24-Jul-14	11	2,700	4.07
Cheptuwoketo	23-Jul-14	11	3,200	3.44
Riwo	23-Jul-14	11	7,600	1.45
Naumaa	27-Jun-14	10	4,300	2.33
Chepturu	03-Sep-14	10	6,990	1.43
Mbaru	27-Jun-14	10	8,090	1.24
Kauriong	27-Jun-14	9	495	18.18
Kitelakapel	18-Jul-14	9	3,800	2.37
Ngengechwo	30-Aug-14	8	2,200	3.64
Lokna	09-Jul-14	8	3,100	2.58
Chesawach	16-Jul-14	8	3,400	2.35
Runo AIC	24-Jul-14	7	1,300	5.38
Cherangan Community	25-Jun-14	7	1,370	5.11
Napawoi	28-Aug-14	7	1,700	4.12
Chepuyal Girls	17-Jul-14	6	700	8.57
Rukei	09-Jul-14	6	4,400	1.36
Katumkale	26-Jun-14	6	8,020	0.75
Chepuyal Boys	17-Jul-14	5	1,460	3.42
Murpus	10-Jul-14	5	2,200	2.27
Chepuyal Community	17-Jul-14	5	2,400	2.08
			-	
Merur Muruebong	09-Jul-14 14-Jul-14	5	5,650	0.88

Page 6 of 7

Ngengechwo	07-Jul-14	1	16,150	0.06
Tomoi	29-Aug-14	1	1,820	0.55
Murunyangai	26-Jun-14	2	9,000	0.23
Napitiro	25-Jun-14	2	7,000	0.29
Katukumwok	26-Jul-14	2	2,850	0.7
Nakwapuo	07-Jul-14	2	2,000	1
Nangorotum	27-Aug-14	2	1,900	1.05
Kalokiru	16-Jul-14	2	1,850	1.08
Konyao (St. Dorcas)	29-Aug-14 01-Sep-14	2	1,550	1.43
Lokotetwo	02-Sep-14	2	953	1.43
Milimani/Bendera Plelkan	28-Aug-14	2	440	2.1
Kishuanet	08-Jul-14	3	4,200	0.71
Chepkopegh	10-Jul-14	3	3,950	0.76
Chepareria Market	22-Jul-14	3	3,500	0.86
			· · · · · · · · · · · · · · · · · · ·	
Tirokow	02-Sep-14	3	2,100	1.43
Kauriong Community	16-Jul-14	3	1,400	2.14
Kauriong Community	27-Jun-14	4	9,300	0.43
Pser	27-Jun-14 27-Aug-14	4	4,900	0.82
Kaa-ptuken	27-Aug-14 27-Jun-14	4	2,500	1.38
Kaplelack-Koror	27-Aug-14	4	2,250	1.78
Nakwangamoru Kaisa	02-Sep-14	4	2,250	1.78
	16-Jul-14	4	1,950	2.05
Tapadany	02-Sep-14	4	1,320	3.03
Atacha	16-Jul-14 	5 4	8,400	0.6
Pusian	22-Jul-14	5	8,100	0.62

Table 2: Reported Cases of Diarrheal Disease in West Pokot County.

of hot spots especially in a large geographical area like West Pokot County, more data points is recommended for future studies.

#### Acknowledgements

We would like to give our sincere gratitude to Lucarelli J from Harvester's Internati o nal for graciously sharing the data and photos of their work with the Pokot people in West Pokot County and the surrounding counties. Your willingness to share and the quality of your work is greatly appreciated.

#### References

- 1. UNICEF & WHO (2015) Progress on Sanitation and Drinking Water: 2015 Update and MDG Assessment. United States of America.
- Prüss-Ustün A, Bartram J, Clasen T, Colford JM, Cumming O, et al. (2014) Burden of disease from inadequate water, sanitation and hygiene in low-and middle-income settings: a retrospective analysis of data from 145 countries. Trop Med Intl Health 19: 894-905.
- Ashbolt NJ (2004) Microbial contamination of drinking water and disease outcomes in developing regions. Toxicology 198: 229-238.
- 4. Ferdous F, Das SK, Ahmed S, Farzana FD, Latham JR, et al. (2013) Severity

of diarrhea and malnutrition among under five-year-old children in rural Bangladesh. Am J Trop Med Hyg 89: 223-228.

- Hasanain FG, Jamsiah M, Zaleha MI, Azmi M, Tamil MA (2012) Association between drinking water sources and diarrhea with Malnutrition among kindergarten's children in Baghdad city, Iraq. Malaysian Journal of Public Health Medicine 12: 45-48.
- Guerrant RL, DeBoer MD, Moore SR, Scharf RJ, Lima AA (2013) The impoverished gut-a triple burden of diarrhoea, stunting and chronic disease. Nat Rev Gastroenterol Hepatol 10: 220-229.
- Hanna-Attisha M, LaChance J, Sadler RC, Champney Schnepp A (2016) Elevated blood lead levels in children associated with the Flint drinking water crisis: a spatial analysis of risk and public health response. Am J Public Health 106: 283-290.
- Bessong PO, Odiyo JO, Musekene JN, Tessema A (2009) Spatial distribution of diarrhoea and microbial quality of domestic water during an outbreak of diarrhoea in the Tshikuwi community in Venda, South Africa. J Health Popul Nutr 27: 652-659.
- Jacob BG, Novak RJ, Toe LD, Sanfo M, Griffith DA, et al. (2013) Validation of a remote sensing model to identify simulium damnosum sl Breeding sites in Sub-Saharan Africa. PLoS Negl Trop Dis 7: e2342.

- Njemanze PC, Anozie J, Ihenacho JO, Russell MJ, Uwaeziozi AB (1999) Application of risk analysis and geographic information system technologies to the prevention of diarrheal diseases in Nigeria. Am J Trop Med Hyg 61: 356-360.
- 11. (2016) County Government of West Pokot.
- 12. ICT Authority (2016) Kenya Open Data Portal.
- 13. Lucarelli J (2016) GIS Mapping for Well Sites for the Pokot People.
- 14. (2015) Kenya National Bureau of Statistics.