WITHIN THE FRAMEWORK OF THE WESA PROJECT PARTNERS:



WATER AND ENERGY SECURITY FOR AFRICA (WESA) PROJECT

Localization of Urban Electricity Reliability Challenges Using Spatial Tools: A Case of Accra, Ghana

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Structure of the presentation

- Setting the stage (what we already know)
- Electricity sector challenges in Africa
- Electricity reliability challenges in Africa
- Emerging issues (what we may not yet understand well, in a scientific sense)
- Electricity reliability issues in Accra, Ghana
- Hypotheses and questions
- Study design and methods
- Results and discussion

Electricity sector challenges in Africa – Low electrification



ELECTRICITY ACCESS, 2017

- Sub-Sahara Africa has lowest electrification rate compared to other world regions
- In most world regions, urban areas often have higher electricity access rates than rural areas.
- In Africa, the urban bias in electrification is even higher (>3 times).

Electricity sector challenges in Africa – High unreliability

POWER OUTAGE EXPERIENCES



Source: World Bank Enterprise surveys

Electricity reliability challenges in Africa – power outages







Source: World Bank Enterprise surveys

Electricity reliability challenges in Africa – power outages (cont'd)

Map 3: Average duration of a typical power outage (hrs)

Map 4: Average proportion of electricity from a generator (%)





Emerging issues – Electricity reliability issues in Accra, Ghana

General News of Thursday, 16 July 2015

Source: Graphic.com.gl

ECG says load-shedding timetable cannot be followed

	former Chief Executive of Ghana's Volta River Authority, to that dumsor was favoring the wealthy: "The only schedule where ECG thinks it will get paid" (Aidoo 2015). ¹⁰ While pr	e early evidence that matters is ioritizing profit
	when targeting limited electricity is reasonable, it will ha concentrating Underpowered: Rolling blackouts in Africa disproportionately hurt the poor	ve the effect of tarian bureau-
nd an 00	l especially ad the peer ntonments, Ridge) have almost complete electricity co or ones (e.g., Chorkor) receive a much lower and mo	hborhoods (e.g overage while other re uncertain supp

"People who are ministers and government officials have electric running for them. [...] Ordinary people have constant blackouts. If you have political power, you have electricity." (Baker from Nkawkaw [Ghana], quoted in Rupp [2013:112])

Hypotheses and questions

<u>Hypotheses</u>

- Electricity unreliability across local communities in Accra, Ghana exhibits substantial spatial variation.
- The spatial patterns of unreliability are influenced by social, economic, and other factors.

<u>Questions</u>

- To what extent do levels of electricity unreliability (*herein measured as load shedding*) vary spatially across communities in Accra, Ghana?
- a) How to disaggregate/localize electricity load shedding experiences to a neighborhood scale?
- b) What variable is appropriate for quantifying neighborhood-level load shedding?
- c) What are the spatial characteristics of load shedding experiences? Where are the hot/cold spots of electricity load shedding?
- d) How does load shedding experience change with changing neighborhood characteristics?

Geographical Context of the study



Map 6: Selected Accra Neighbourhoods



Study design

Study characteristics

- Study area– 47 communities in Accra Metropolis
- Data Power network map; outage statistics; census data
- Target group Residential sector (households)

Neighbourhood definition

- Neighbourhood is defined here as a spatial unit made up of geographically linked enumeration areas (EAs) with relative similarity in socioeconomic characteristics, and generally accepted as one social unit by the local population.
- Study area map used was extracted from Engstrom et al. (2013)

Electricity distribution network map

The 11 kv electricity network (feeders and transformers) was most relevant for this study. The network map covering the study area was obtained as an AUTOCAD drawing. It was imported into ArcGIS and georeferenced.

Methods - Linking electricity load shedding to communities



- 11kv electricity feeder map was overlaid onto the neighbourhood map within ArcMap 10.5.1.
- Presence of an 11kv step-down transformer in a neighbourhood was used to validate that a given feeder supplied electricity to that neighbourhood.

Methods - Estimating neighborhood-level load shedding

Load shedding exposure, LS_e variable: Defined as the cumulative number of load shedding outage hours (or minutes) experienced on any single electricity feeder serving a given neighborhood.

$$LS_e = LS_f \times LS_d$$

 $LS_f = \frac{Total \, number \, of \, load \, shedding \, outages \, experienced \, on \, all \, feeders \, serving \, a \, neighbourhood}{Total \, number \, of \, electricity \, feeders \, serving \, the \, neighbourhood}$

 $LS_d = \frac{Sum of the duration of all load shedding outages experienced in a given neighbourhood}{Total number of load shedding outages experienced in the neighbourhood}$

Dealing with missing data:

• Geostatistical Analyst Tool and Areal Interpolation Layer to Polygons in ArcGIS

Normalization:

 Neighbourhood surface area, population and population density values were used to normalize of load shedding exposure values

Results – Visualized load shedding exposure and its normalizations

High exposure areas

- Awoshie
- Ordokor
- Dansoman
- Achimota •

Low exposure areas

- Industrial • Areas
- Korle Bu ٠
- Adabraka •
- Mamponse •



High exposure areas

- Sabon Zongo ٠
- Tudu ٠

В

8

Kilometers

- Old Dansoman •
- Korle Dudor ٠

Load shedding exposure (hours) Natural Breaks Classification



Ν

- Ratio of load shedding exposure to surface area (hours/sq. km) Natural Breaks Classification
- 362 1135 1136 - 2555 2556 - 4611 4612 - 11151

Map 8: Neighbourhood load shedding exposure (A) and load shedding exposure per unit area (B)

Results - Visualized load shedding exposure and its normalizations (cont'd)

High exposure areas

- Awudome
 Estate
- Santa Maria
- Tesano
- North Ridge



Ratio of load shedding exposure to population (minutes/capita) Natural Breaks Classification



Ratio of load shedding exposure to population density (minutes/capita/sq. km) Natural Breaks Classification



Map 9: Neighbourhood ratios of load shedding exposure to population (A) and load shedding exposure to population density (B)

Results – Spatial characteristics of load shedding exposure variables

<u>Global spatial autocorrelation (GSA) analysis</u>: Used global Moran's I statistic in ArcGIS to assess the level of similarity of one value relative to other values surrounding it. This tells us the overall spatial pattern of our values.



Variable	Moran's Index	z-score	p-value
Load shedding exposure	0.278730	4.780856	0.000002
Load shedding exposure per unit area	-0.076011	-0.616699	0.537433
Load shedding exposure to population ratio	0.089964	1.476733	0.139747
Ratio of load shedding exposure to population density	0.170645	2.363366	0.018110

Given the z-score of 4.78085602809, there is a less than 1% likelihood that this clustered pattern could be the result of random chance.

Fig: Spatial autocorrelation report for load shedding exposure

Results – Spatial characteristics of load shedding exposure variables

Local indicators of spatial autocorrelation (LISA) – Used the Getis-Ord Gi* statistic and Anselin Local Moran's I statistic also available in ArcGIS. These help to locate hot/cold spots and clusters or outliers respectively.



Map 10: Neighbourhood load shedding exposure (A) and corresponding Hot Spot analysis (B) and Cluster and Outlier analysis (C)

Results - Spatial characteristics of load shedding exposure per unit area



Map 11: Neighbourhood load shedding exposure per unit area (A) and corresponding Hot Spot analysis (B) and Cluster and Outlier analysis (C)

Results – Spatial characteristics of ratio of load shedding exposure to population



Map 12: Neighbourhood ratio of load shedding exposure to population (A) and corresponding Hot Spot analysis (B) and Cluster and Outlier analysis (C)

Results – Spatial characteristics of ratio of load shedding exposure to population density



Map 13: Neighbourhood ratio of load shedding exposure to population density (A) and corresponding Hot Spot analysis (B) and Cluster and Outlier analysis (C)

Results - Load shedding and socioeconomic factors

How load shedding exposure relates to select neighbourhood-level socioeconomic factors

							Use of
					Housing	Level of	modern
				Population	Quality	charcoal	sewerage
		Area	Population	density	Indicator	use	services
Load shedding	Correlation	245	.056	.250	002	.046	064
exposure, <i>LS_e</i>	Significance	.097	.707	.090	.987	.757	.667
LS _e /area	Correlation	707**	423**	.356*	039	.041	022
	Significance	.000	.003	.014	.794	.784	.884
LS_e /population	Correlation	349*	616**	361*	.540**	482**	.476**
	Significance	.016	.000	.013	.000	.001	.001
<i>LS_e / population density</i>	Correlation	.169	508**	645**	.579**	567**	.575**
	Significance	.257	.000	.000	.000	.000	.000

*. Correlation is significant at 0.05 level (2-tailed); **. Correlation is significant at 0.01 level (2-tailed). Correlation based on Pearson correlation coefficient.

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THANK YOU VERY MUCH FOR **YOUR ATTENTION**

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