

Best Actuarial Practices in Health Studies Seminar

June 13-14, 2016 | Philadelphia, PA

Session 8: Data Visualization – the Functional Art

Presenter:

Alberto Cairo



# VISUALIZATION FOR EVERYONE Charts, Maps, and Diagrams for Effective Communication

# elmundo.es (Spain), 2000-2005







Agenciae Rokow Prote-Geologica (Achero-Carte Le-mail



NASA/ Space ann / Elaboración propia Gouloux Alberto-Cairo I e-mail









### Tiroteo en Ciudad Lineal

### El tiroteo

El primer sicario se sitila tras las víctimas y les dispara tres mfagas con su Kalashnikov (la policia ha recogido mas de 50 casquillos de bala). Uno de los hombres sobresive a los primeros disparos, pero el ascaino lo remata en el suelo. Según algunos testigos, una de las víctimas intentó repeier la agresión con una pistola, pero no pudo disparar.



## UNC-Chapel Hill, 2005-2010



### News & Events



Journalism school deans respond to the Charlie Hebdo attack



UNC J-school students place in Hearst broadcast, photojournalism and writing competitions



Stuart Scott, 1965 - 2015

### ✓ @UNCJschool

RT @Sarah\_Kaylan: Learning about the basics of #visualcontent and framing in #JOMC 221 today! @UNCJschool http://t.co/ta2null2rb

19 min 34 sec ago →13★

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1 of 10 >

## Editora Globo, Época magazine (Brazil) 2010-2011



# the functional art 2012

an introduction to information graphics and visualization



A visualization is a graphical representation designed to enable exploration, analysis, or communication

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23	1419	-18.60	1.51	-18.50	1.24	6	-0.19			0.03	-1.63	0.63	3	-0.39	1.03	0.08	-1.5	96 (	0.83	0.19	-0.8	-1.17	-0.78	0.17
24	1420	-19.50	1.51	-17.40		7	-0.37			-2.2	-0.31	-0.8		0.34	-0.97	0.96	-1.1		0.03	0.72	-0.11	0.03	0.76	0.3
25	1421	-18.30	1.51	-18.20		8	-2.6			0.78	0.47	-0.76		0.55	-0.43	0.6			0.37	0.42	-0.03	-0.81	-0.35	0.36
27	1423	-16.70	1.20	-18.70	1.22	10	1.24			0.62	1.45	-0.5		0.92	-1	0.58	-0.1		0.57	0.16	-1.17	-0.05	-0.29	-0.64
28	1424	-15.50	1.65	-19.20		11	-1.63			1.51 0.12	0.86	-1.04		0.24	-0.94	0.77	0.1		2.42	0.25	-0.45	-0.78	-0.14	0.21
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32	1428	-18.60	1.34	-17.30	1.45	15	0.03			1.53	0.79	0.18		-0.05	-0.42	-0.31	-1.6		-0.7	-0.2	-0.22	-0.24	-0.03	0.59
33	1429	-16.60	1.63	-17.90		17	0.7	0.8		1.46	0.23	-0.17		0.87	-0.32	1.09	-0.0		0.09	-0.22	0.64	-0.14	-0.19	-0.13
34	1430 1431	-16.80	1.18	-18.80		18	-0.13			0.54	1.36	-0.3		0.71	-0.1	1.27	-1.2		1.19	-0.89	-0.64	0.36	-0.62	-0.8
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41	1437	-18.10	1.60	-17.70	1.17	25	-1	0.6	4 -1	0.47	-0.91	-0.9	6	0.88	-0.06	-0.1	-1.2	. 6	1.01	-0.84	-0.14	0.44	-0.73	-0.17
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Michael E. Mann, Raymond S. Bradley, and Malcolm K. Hughes Intergovernmental Panel on Climate Change (IPCC), Third Report, 2001

# William Playfair, The Commercial and Political Atlas



http://en.wikipedia.org/wiki/William\_Playfair

### John W. Tukey

### EXPLORATORY DATA ANALYSIS





B.H. ERICKSON AND T.A. NOSANCHUK



INTRODUCTION TO THE PRACTICE OF STATISTICS



### How Y'all, Youse and You Guys Talk

What does the way you speak say about where you're from? Answer all the questions below to see your personal dialect map.

### Your Map

See the pattern of your dialect in the map below. Three of the most similar cities are shown.



These maps show your most distinctive answer for each of these cities.



http://www.nytimes.com/interactive/2013/12/20/sunday-review/dialect-quiz-map.html

ST	ATE								GENDER		RACE		AGE	
AL	AK	AZ	AR	CA	СО	СТ	DE	DC	Male	948	White	494	Under 18	18
FL	GA	HI	ID	IL	IN	IA	KS	KY	Female	42	Black	258	18 to 29	330
LA	ME	MD	MA	MI	MN	MS	MO	MT	Unknown	0	Hispanic	172	30 to 44	353
NE	NV	NH	NJ	NM	NY	NC	ND	ОН	WEAPON		Other	38	45 and up	277
ок	OR	PA	RI	SC	SD	ΤN	ΤХ	UT	WEAPON		Unknown	28	Unknown	12
									Deadly weapon	783				
VI	VA	WA WV WI WY		Vehicle	54	SIGNS OF MENTAL ILLNESS		THREAT LEVEL						
									Toy weapon	34	Yes	250	Attack in progress	730
									Unarmed	93	No or unknown	740	Other	216
									Unknown	26			Undetermined	44

### ▲ TAP TO HIDE THESE FILTERS ▲

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### SHOOTINGS BY POLICE PER MONTH IN 2015

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### https://www.washingtonpost.com/graphics/national/police-shootings/



http://www.tampabay.com/projects/2015/investigations/pinellas-failure-factories/chart-failing-black-students/

### **Journalist's Resource**

Research on today's news topics



G   S  S	Browse studies database	Skills	Experts	Syllab
Find studies, reports, data	and more: keyword			٩

### ADS, PUBLIC OPINION, PUBLIC HEALTH

How "scientific" graphs and formulas can increase the persuasiveness of advertising media

Last updated: December 3, 2014

Research Findings Feedback



"New and improved!" is the oldest line in the advertising book, but it's a book that has gotten plenty crowded in recent years. Once restricted to blazingly obvious banner ads, online advertisers now track users' behavior and slip promotions into search results, Twitter feeds, and Facebook pages. Traditional ads have been joined by "native advertising," which is designed to look like editorial content, and its ability to deceive consumers has received pointed attention from the Federal Trade Commission.

Share

Tweet

Whether ads are on broadcast media, in print, or online,

their effectiveness has been the subject of substantial academic research. A 2013 study published in *Political Communication* found that for political advertising, most persuasion effects are short-lived, particularly with state and local elections. A 2011 study from the University of Toronto and MIT found that increasing online ad visibility could improve viewer interest, but could also backfire. "Contextually targeted" ads were found to increase a viewer's interest more than highly visible ones, but tended to be less memorable.

These are not minor questions given the immense amount of money spent on advertising — a projected \$182 billion in the United States alone in 2015. A fast-growing segment is direct-toconsumer advertising by pharmaceutical companies. According to a 2014 University of Pennsylvania study, pharmaceutical companies spent \$3 billion on consumer advertising in 2012 — more than 20 times what they spent on clinical trials. Such ads often feature claims about the drugs' effectiveness in an attempt to influence consumer decisions, often about subjects about which they had little understanding.

### FULL TEXT O



### RELATED PO















OTHER DATA

# Not only informative, but also persuasive

http://www.thefunctionalart.com/2016/01/research-onpersuasive-visualization.html



# TECHNOLOGIES

## Excel can take you a long way





### Getting Started:

- R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To <u>download R</u>, please choose your preferred <u>CRAN mirror</u>.
- If you have questions about R like how to download and install the software, or what the license terms are, please read our <u>answers to frequently asked</u> <u>questions</u> before you send an email.

### News:

- R version 3.1.2 (Pumpkin Helmet) has been released on 2014-10-31.
- The R Journal Volume 6/1 is available.
- <u>useR! 2014</u>, took place at the University of California, Los Angeles, USA June 30 - July 3, 2014.
- R version 3.0.3 (Warm Puppy) has been released on 2014-03-06.
- useR! 2015, will take place at the University of Aalborg, Denmark, June 30 -July 3, 2015.

This server is hosted by the <u>Institute for Statistics and Mathematics</u> of <u>WU</u> (Wirtschaftsuniversität Wien).

# ggplot2

ggplot2 is a plotting system for R, based on the grammar of graphics, which tries to take to of the fiddly details that make plotting a hassle (like drawing legends) as well as providing

### Documentation

ggplot2 documentation is now available at docs.ggplot2.org.

### Mailing list

You are welcome to ask ggplot2 questions on R-help, but if you'd like to participate in a mo

Your email address:

Subscribe

You must be a member to post messages, but anyone can read the archived discussions.

### Bring your data to life with Microsoft Power BI

Microsoft Power BI transforms your company's data into rich visuals for you to collect and organize so you can focus on what matters to you. Stay in the know, spot trends as they happen, and push your business further.

Get started free







### The R Project for Statistical Computing

Microsoft Power BI

Bring your data to life

with Microsoft Power BI

### Getting Started:

- R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To download R, please choose your preferred CRAN mirror.
- · If you have questions about R like how to download and install the software, or what the license terms are, please read our answers to frequently asked questions before you send an email.

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Your email address:

Subscribe

You must be a member to post messages, but anyone can read the archived discussions.

# Illustrator CC





### Easily **explore data** and **discover trends** *without* learning complex software



https://www.stat.auckland.ac.nz/~wild/iNZight/index.php

### yeroon.net/ggplot2

### Introduction

yeroon.net/ggplot2 is a web interface for Hadley Wickham's R package ggplot2. It is used as a tool for rapid prototyping, exploratory graphical analysis and education of statistics and R. The interface is written completely in javascript, therefore there is no need to install anything on the client side: a standard browser will do. All major browsers are supported but a recent and standards-compliant browser is highly recommended. Best performance is achieved by using Google Chrome.

### Mirrors

Currently these public mirrors are available:

- rweb.stat.ucla.edu (Up) (US mirror by UCLA dept. of Statistics)
- labs.dataspora.com (Up) (US mirror by Michael Driscoll)
- app.rapache.net (Up) (US mirror by Jeffrey Horner)

More mirrors are needed to keep this application online. If you are able to supply or sponsor a dedicated or virtual server, please contact the author.

# **i** Microsoft (Microsoft) **i** Microsoft (Microsoft)

### Use case videos

### http://www.stat.ucla.edu/~jeroen/ggplot2/





# CHALLENGE: Becoming software-driven

Good graphics...

# 1. They are based on good data

Good graphics...

They are based on good data
 They attract readers' attention

# Good graphics...

They are based on good data
 They attract readers' attention
 They don't frustrate readers

# Good graphics...

- They are based on good data
  They attract readers' attention
  They don't frustrate readers
- 4. They show the right amount of data

# Good graphics...

# They are based on good data They attract readers' attention They don't frustrate readers They show the right amount of data



### **DELIVERING THE FUTURE**

Explore the world created by America's Internet and television innovators.

# CHECKTHE NUMBERS

Get the Facts About Broadband Investment and Innovation



Total U.S. Broadband Industry Investment since 1999







# Less regulation = More Industry Investment



# 1993-1996 1999-2003

Based on a chart by the National Cable & Telecommunications Association



# Good graphics...

# They are based on good data They attract readers' attention They don't frustrate readers They show the right amount of data



### Graphic by Kir Khachaturov





### http://www.thefunctionalart.com/2015/02/redesigning-circular-timeline.html



# CHOOSING GRAPHIC FORMS
#### The Data Visualisation Catalogue

About · Suggest · Shop · Resources



#### Ann K. Emery

data analysis + visualization

#### EMERY'S ESSENTIALS Chart Choosing Tool

ALL / SMALL MULTIPLES / COMPARING 2 OR MORE CATEGORIES / RANGES OR DISPERSION / PART TO WHOLE / DO-ABLE IN EXCEL / GEOGRAPHIC MAPS / RELATIONSHIPS / COLLAGES / QUALITATIVE / EXPLORATORY / CORRELATION / 1 POINT IN TIME / 2 POINTS IN TIME / 3+ POINTS IN TIME



# .com/ <u>http://annkemery.com/essentials/</u>

# What graphic forms are more appropriate to represent your data?

Think about the audience and the publication
 Think of the questions your graphic should help readers answer
 Can you understand it without reading every single figure?



## Based on Cleveland and Robert McGill (1984)



## Based on Cleveland and Robert McGill (1984)



Great for accurate judgments: Comparisons, relationships, etc.



## Based on Cleveland and Robert McGill (1984)



## Based on Cleveland and Robert McGill (1984)

#### In a Decisive Victory, Obama Reshapes the Electoral Map



17

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1.442,613,48%

54,255,807 475

107%

100

\$5,888,492 SPS





# Using graphic forms erroneously

# How Music Preferences Have Changed in Two Decades

Music styles preferred by University of Miami students. Survey based on interviews with 1,000 students. **SOURCE: WishfulThinkingData Inc.** 



# How Music Preferences Have Changed in Two Decades

Music styles preferred by University of Miami students. Survey based on interviews with 1,000 students. SOURCE: WishfulThinkingData Inc.



Alberto Cairo • University of Miami • <u>www.thefunctionalart.com</u> • Twitter: @albertocairo

# ENGAGING VISUALIZATION





How Brazil can take advantage of a future with fewer children per couple.

Alberto Cairo, Francine Lima, Marco Vergotti

#### PRELIMINARY DATA FROM THE 2010 CENSUS create an interesting picture of the changes

that the Brazilian population has gone through in the past ten years. Brazil's population grew, on average, 10% between 2000 and 2010, but the fertility rate is below 2.1 children per woman, the minimum to keep a population from shrinking. According to César Marques, a demographer from the University of Campinas, the main challenge Brazil will face in the future is how to maintain a healthy Social Security system if the number of older and retired people will likely be much larger than it is today. Read on to learn about all the variables at play in this story.

#### BRAZIL'S POPULATION IS BIGGER

he 2010 Census has revealed a 9.4%	
opulation increase between	
000 and 2010. The differences betwee	en
tates, as you can see on the chart	
n the right, are noticeable. Mest rich	
tates, such as São Paulo and Rio, didni	t.
row as fast as the ones in the north ea	ĸŧ.
000 000	20
100 73	

will eventually start to shrink and grow older.

mber of children

per we

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4

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2

Replacement

level average of 2.1 children per woman

2 -BUT THE FERTILITY RATE IS MUCH LOWER THAN EXPECTED

per woman, on average, But new data collected by the IBGE prove that

A study in 2004 estimated that in 2010, the fertility rate would be 2.4 children

the fertility rate is already 1.9. below the threshold called "replacement rate" When the fertility rate drops below this number, the population of a country



Each line

represents a country or continen

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OKENA 06,2080

#### from a total of 5.506, lost population. Rio Grandle do Sul is the state with a the largest number of municipalities that lost inhabitants. due to a significant drop in fertility rates and domestic migration

10.4%

+0.7%

-0.7%

Sources (BGE, UK, Morld Bank, Caser Marques (UNICAM)

#### AS A CONSEQUENCE, POPULATION WILL STOP GROWING-

Forecasts made in 2004 anticipated that Brazil's population would stop growing in 2040. But the most recent data from the IBGE suggests that this could happen much earler, in 2030.





#### How Brazil can transform the population challenge into an opportunity

As the population ages, the proportion of people of working age increases. The country will therefore have more people producing wealth (if the labor market can absorb them) and fewer children to consume investments. It is a window of opportunity, because in some cases the number of people of working age to fail back when older people are leaving the market. ts. It is a

e population under 15 years of age is failing today. A smaller number of dent in public schools will facilitate the quality of teaching, if the amount ested in education stays the same.

ducational policy focused on low-income youth favors the formation of more illed workforce and greater social mobility.

In the future. Brazil will reach the stage of Europe and Japan, which struggle to support their elders. This is why it's so important to prepare a more balance refirement system, which will include refirement at a later age.

# Build a narrative; integrate words and visuals



#### Brazil's Demographic Opportunity

How Brazil can take advantage of a future with fewer children per couple.

#### Alberto Cairo, Francine Lima, Marco Vergotti

#### PRELIMINARY DATA FROM THE 2010 CENSUS

create an interesting picture of the changes that the Brazilian population has gone through in the past ten years. Brazil's population grew, on average, 10% between 2000 and 2010, but the fertility rate is below 2.1 children per woman, the minimum to keep a population from shrinking. According to César Marques, a demographer from the University of Campinas, the main challenge Brazil will face in the future is how to maintain a healthy Social Security system if the number of older and retired people will likely be much larger than it is today. Read on to learn about all the variables at play in this story.

#### BRAZIL'S POPULATION IS BIGGER

The 2010 Census has revealed a 9.4% population increase between 2000 and 2010. The differences between states, as you can see on the chart on the right, are noticeable. Most rich states, such as São Paulo and Rio, didn't grow as fast as the ones in the north east.

2000	169.799.170
2010	190,732,694



Sources: IBGE, UN, World Benk, Celser Marques (UNICAMP)

#### 2 –BUT THE FERTILITY RATE IS MUCH LOWER THAN EXPECTED

A study in 2004 estimated that in 2010, the fertility rate would be 2.4 children per woman, on average. But new data collected by the IBGE prove that the fertility rate is already 1.9, below the threshold called "replacement rate".

AVERAGE +9.4%

#### 3 AS A CONSEQUENCE, POPULATION WILL STOP GROWING-

Forecasts made in 2004 anticipated that Brazil's population would stop growing in 2040. But the most recent data from the IBGE suggests that this could happen much earler, in 2030. population increase between 2000 and 2010. The differences between states, as you can see on the chart on the right, are noticeable. Most rich states, such as São Paulo and Rio, didn't grow as fast as the ones in the north east.

2000	169.799.170		
2010	190,732,694		

	4/8/84/4-150	2,020,220		a.a.,
PE	7,918,344	8,541,250	-	7.9%
SP	37.032.403	39,924,091	-	7.8%
PR	9,563,458	10,266,737	-	7.4%
MG	17.891,494	19,159,260	-	7.1%
RJ.	14,391,282	15,180,636	-	5.5%
BA.	13,070,250	13,633,969	-	4.3%
85	10,187,796	10,576,758		3.6%

Below

average

2000 and 2010, 1,630 cities and towns, from a total of 5,506, lost population. Rio Grande do Sul is the state with a the largest number of municipalities that lost inhabitants, due to a significant drop in fertility rates and domestic migration

Sources: IBGE, UN, World Bank, Celsar Marques (UNICAMP)

#### 2 –BUT THE FERTILITY RATE IS MUCH LOWER THAN EXPECTED

A study in 2004 estimated that in 2010, the fertility rate would be 2.4 children per woman, on average. But new data collected by the IBGE prove that the fertility rate is already 1.9, below the threshold called "replacement rate". When the fertility rate drops below this number, the population of a country will eventually start to shrink and grow older.



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Forecasts made in 2004 anticipated that Brazil's population would stop growing in 2040. But the most recent data from the IBGE suggests that this could happen much earler, in 2030.





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- As the population ages, the proportion of people of working age increases. The country will therefore have more people producing wealth (if the labor market can absorb them) and fewer children to consume investments. It is a window of opportunity, because in some cases the number of people of working age to fall back when older people are leaving the market.
- The population under 15 years of age is falling today. A smaller number of student in public schools will facilitate the quality of teaching, if the amount invested in education stays the same.
- Educational policy focused on low-income youth favors the formation of more skilled workforce and greater social mobility.

In the future, Brazil will reach the stage of Europe and Japan, which struggle to support their elders. This is why it's so important to prepare a more balanced retirement system, which will include retirement at a later age.

# Pay attention at visual design



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# Somalia leads the countries that participated in the survey

#### Thousands of unemployed people



Source: CompletelyFakeData Inc.

Graphic by ACME

# Pay attention at visual design

#### Multi-scale Modeling and Assessment of Malaria Risk in Northern South America

Alimi, T. O.<sup>1</sup>; Fuller, D. O.<sup>1,2</sup> and Beier, J.C.<sup>1,3</sup>

<sup>1</sup> Abess Center for Ecosystem Science and Policy; <sup>2</sup> Department of Geography and Regional Studies; <sup>3</sup> Department of Epidemiology and Public Health, University of Miami

#### 1. Introduction

The public health problem posed by malaria has made it a top priority for control efforts and the general consensus globally, is that its elimination is crucial for continued international development. Consequently, there is ongoing research in different regions including South America (SA) to better understand the disease dynamics with the intent that findings may establish scientific framework that would support the development of new intervention strategies for malaria elimination in areas with seasonal malaria. One of such investigations is undertaken by the International Centers of Excellence in Malaria Research (ICEMR) under a National Institutes of Health (NIH) grant.

While only about 3% of the global malaria burden is borne by SA<sup>1</sup>, undertaking malaria research in the region is currently important because an estimated 23million people are still at risk<sup>2</sup> and approximately about 80% of clinical cases are found in Northern South America (NSA)<sup>3</sup>. A key factor limiting effective control is lack of data and uneven implementation of control measures, including use of bednets, sprays, early diagnosis, and treatment. As part of the ICEMR investigation, this project seeks to model the spatial patterns of malaria risk in NSA through vector distribution and land-use changes. Furthermore, I intend to investigate the perceptions of malaria risk in order to identify barriers to adoption and how they can be circumvented.

#### 2. Significance

Spatial distribution of malaria risk is still perceived as broadly categorized by the WHO's traditional risk maps which are highly generalized, of low resolution and have broad categories with uncertain boundaries (see da Nunes-Silva et al. 2012). There is need for up- to-date high resolution risk maps which can aid malaria control efforts. Secondly, modeling distribution of principal malaria vectors and land use changes which may explain the observed distribution and risk are useful tools which would guide future management strategies. Finally, understanding the perceptions of at risk populations may help address barriers to adoption of interventions and influence policies. Overall, findings will empower NMCPs to achieve effective control and move them closer to elimination.

#### 3. Specific Aims

- > Specific Aim 1: Model the spatial patterns of malaria risk through vector distribution and land use changes
  - Hypothesis 1.1: GIS-based Multi-Criteria Evaluation (MCE) model can accurately predict spatial extent of malaria risk areas. <u>Objective</u> Generate risk maps that represent risk of malaria transmission.
  - Hypothesis 1.2: The Maximum Entropy (Maxent) model can accurately depict actual and predict potential distribution of three Anopheles species. <u>Objective</u>: Model observed and potential spread of An. albimanus, An. darlingi, and An. nuneztovari.
  - Hypothesis 1.3: Land- use changes can explain the variations in predicted malaria risk. <u>Objective</u>: Characterize land use land cover (LULC) and investigate changes in areas of risk.
- Specific Aim 2: Investigate the perceptions of malaria risk in order to identify barriers to adoption and how they can be circumvented.
  - Hypothesis 2.1: Knowledge of perception of malaria risk can aid design of malaria control strategies. <u>Objective</u>: Obtain and analyze data on subjective perceptions of risk.
  - Hypothesis 2.2: Identification of barriers to adoption of malaria control interventions provide means of tackling them. <u>Objective</u>: Analyze data addressing perceived barriers and policy implications

\*Only ongoing work on Hypothesis 1.1 in presented here

#### 4. Materials and Methods

Study Area: is NSA comprising of ten countries- Bolivia. Brazil, Colombia, Ecuador. French Guiana, Guyana, Panama, Peru, Suriname and Venezuela. These countries account for approximately 90% of clinical cases in the region hence, the choice as study area (Fig. 1).

# Legend Image: selection of the selection of t

Research Approach: Due to the complexity of malaria problem. I'm employing an interdisciplinary approach to address the problem (Fig. 2).



- Materials: Raster data layers of environmental, climatic and anthropogenic parameters from satellite imageries, weather monitoring stations, global land cover and population data were collected from Worldclim, Digital Charts of the World, Globcover and Landscan. Vector data was collected from field sampling by our collaborators and the Walter Reed Biosystematics Unit. Sociological data would be collected through questionnaires to be administered in one of the study area. Other data will be collected as needed.
- Procedure: To test hypothesis 1.1. raster data of parameters that influence mosquito distribution (rivers, wetlands, urban areas, roads, population and elevation) were combined using a Multi-Criteria Evaluation in Idrisi GIS package. This produced a map of potential exposure to malaria vectors which is used as a proxy for risk of malaria transmission. All the data layers were gridded at 1km spatial resolution. A set of distance layers had been created for discrete factors using standard GIS operations. All factors were subsequently standardized into a continuous common numeric range on a byte 0-255 probability scale using a fuzzy function based on knowledge of mosquito interaction with the factor. Weights were generated for each factor based on the importance of the factor to malaria transmission by expert opinions and then assigned using Analytical Hierarchy Process. The risk maps produced were validated statistically using data on An. darlingi distribution and malaria case data from some parts of the study area. See preliminary results (Fig. 3.4.5)

#### 5. Preliminary Results

Study Area: is NSA comprising of ten countries- Bolivia, Brazil, Colombia, Ecuador, French Guiana, Guyana, Panama, Peru, Suriname and Venezuela. These countries anophelines collected.



Figure 3: Potential risk of exposure to malaria vectors across NSA (0 indicate little or no risk while 233 indicate high risk)

Risk scores for mosquito occurrence points were significantly higher than those generated randomly (Fig. 4).

Comparing mean of random and DV points for MCE risk map



Figure 4: Plot showing the MCE risk values for randomly sampled points and for occurrence points of a DV. An. durling/

#### 6. Conclusion

Findings from preliminary results suggest that the MCE approach is a viable method to modeling spatial risk. The high resolution risk map produced aligned well with sampled vector points and may therefore be used to plan control of malaria vectors. Further analysis is planned to generate and validate risk maps with actual measures of malaria transmission, results of which could be used to plan containment of future outbreaks.

#### References

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# Pay attention at visual design

#### Multi-scale Modeling and Assessment of Malaria Risk in Northern South America

Alimi, T. O.1; Fuller, D. O.1,2 and Beier, J.C.1,3

#### 1 Introduction

Malaria as a public health problem has become a priority for control efforts worldwide. The global consensus is that its elimination is crucial for continual development. Ongoing research projects in different regions, including South America (SA), try to improve our understanding of the disease dynamics. Their goal is to establish a new framework that would lead to new intervention strategies for malaria elimination in areas where the disease is seasonal. One of such investigations is undertaken by the International Centers of Excellence in Malaria Research (ICEMR) under a National Institutes of Health grant.

While only about 3% of the global malaria burden is borne by SA1, undertaking malaria research in the region is currently important because an estimated 23million people are still at risk 2 and approximately about 80% of clinical cases are found in **Northern South America (NSA)** 3. A key factor limiting elective control is lack of data and uneven implementation of control measures, including use of bednets, sprays, early diagnosis, and treatment. As part of the ICEMR investigation, this project seeks to model the spatial patterns of malaria risk in NSA through vector distribution and land-use changes. Furthermore, I intend to investigate the perceptions of malaria risk in order to identify barriers to adoption and how they can be circumvented.

#### 2 Significance

Spatial distribution of malaria risk is still perceived as broadly categorized by the WHO's traditional risk maps which are highly generalized, of low resolution and have broad categories with uncertain boundaries (see da Nunes-Silva et al. 2012). There is need for up- to-date high resolution risk maps which can aid malaria control eorts. Secondly, modeling distribution of principal malaria vectors and land use changes which may explain the observed distribution and risk are useful tools which would guide future management strategies. Finally, understanding the perceptions of at risk populations may help address barriers to adoption of interventions and influence policies. Overall, findings will empower NMCPs to achieve eective control and move them closer to elimination.

#### 3 Aims

Specific Aim 1: Model the spatial patterns of malaria risk through vector distribution and land use changes

- Hypothesis I.1: GIS-based Multi-Oriteria Evaluation (MCE) model can accurately predict spatial extent of malaria risk areas. Objective: Generate risk maps that represent risk of malaria transmission
- Hypothesis 1.2: The Maximum Entropy (Maxent) model can accurately depict actual and predict potential distribution of three Anopheles species. Objective: Model observed and potential spread of An. albimanus, An. darlingi , and An. nunextovari.
- Hypothesis 1.3: Land- use changes can explain the variations in predicted malaria risk.
  Objective: Characterize land use land cover (LULC) and investigate changes in areas of risk.

Specific Aim 2: Investigate the perceptions of malaria risk in order to identify barriers to adoption and how they can be circumvented.

- Hypothesis 2.1: Knowledge of perception of malaria risk can aid design of malaria control strategies. Objective: Obtain and analyze data on subjective perceptions of risk.
- Hypothesis 2.2: Identification of barriers to adoption of malaria, control interventions provide means of tackling them. Objective: Analyze data addressing perceived barriers and policy implications

#### 4 Materials and methods



Research approach: Due to the complexity of malaria problem, I'm employing an interdisciplinary approach to address the problem.



Materials: Raster data layers of environmental, climatic and anthropogenic parameters from satellite imageries, weather monitoring stations, global land cover and population data were collected from Worldclim , Digital Charts of the World, Globcover and Landscan. Vector data was collected from Eleid sampling by our collaborators and the Walter Reed Biosystematics Unit. Sociological data would be collected through questionnaires to be administered in one of the study area. Other data will be collected as needed.

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#### UNIVERSITY OF MIAMI ABESS CENTER for ECOSYSTEM SCIENCE & POLICY

#### 5 Preliminary results

Areas of high to moderate risk corresponded with locations of some of the anophelines collected.



Risk scores for mosquito occurrence points were significantly higher than those generated randomly.

Comparing mean of random and DV points for MCE risk map - p<0.05



#### 6 Conclusion

Findings from preliminary results suggest that the MCE approach is a viable method to modeling spatial risk. The high resolution risk map produced aligned well with sampled vector points and may therefore be used to plan control of malaria vectors. Further analysis is planned to generate and validate risk maps with actual measures of malaria transmission, results of which could be used to plan containment of future outbreaks.

#### References

- . WHO. (2007). MALAREA ELIMINATION : A field manual for low and moderate endemic countries ARHO (2012) PAHO Honors 2012 Malaria Champions of the Americas.
- http:// new.paho.org/hg/index\_php?option=com\_content8view=article8id=.7429.8itemid=.39639. Gusmao R. (1999) Overview of malaria control in the Americas. Parasitologia 41:355-60.
- 4. Da Silva-Humes, M., Mormo, M., Conn, JE., Gamboa, D., Abeles, S., Vinntz, J.M., and Ferreira, M.U. (2012) Amazonian malaria: Asymptomatic human reservoirs, diagnostic challenges, environmentally driven changes in mosquito vector populations, and the mandate for sustainable control strategies. Acta Topica 121 (3): 281-29

# If possible, make it customizable

#### HealthCare.gov Explorer

See the rates for health plans available through HealthCare.gov, the federal insurance exchange. Many consumers will also be eligible for federal subsidies to help buy coverage through the exchanges, and may pay lower rates. Plans are labeled Catastrophic, Bronze, Silver, Gold or Platinum depending on the level of coverage.

Interactive by: Martin Burch, Madeline Farbman, Jonathan Keegan, Adam Suharja, Christopher Weaver. Kurt Wilberding/The Wall Street Journal.

Write to the editors at WSJGraphicsEditors@WSJ.com.

AGE	PLAN TYPE	STATE	COUNTY	OR ADDRESS		
30	Silver 👻	Alabama 👻	Autauga 👻		SEARCH	C GEO LOCATE

#### Range of prices for lowest-cost Silver plans on HealthCare.gov



http://graphics.wsj.com/health-care-explorer/







# THANKYOU!

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