What proportion of the U.S. is within a mile of a road?

Nicholas J. Horton

Department of Mathematics and Statistics Smith College Northampton, MA

March 22, 2011

nhorton@smith.edu http://www.math.smith.edu/ \sim nhorton

Introduction

- goal motivate the estimation of unknown population parameters
- activity estimate the proportion of the continental United States that is within a mile of a road
- process repeatedly sample latitudes and longitudes and explore properties of that location using an internet mapping service
- outcome individual as well as class-wide estimates (and associated confidence intervals) for the proportion
- technology straightforward to implement in general purpose statistical software

・ 同 ト ・ ヨ ト ・ ヨ ト

Acknowledgements

- derived from an activity developed by Danny Kaplan (Macalester College)
- work supported by the MOSAIC project (NSF funded community of educators working to develop a new way to introduce mathematics, statistics, computation and modeling to students in colleges and universities, www.mosaic-web.org
- more information and downloadable resources (handouts, sample data, R code and these slides) available from www.math.smith.edu/~nhorton/roadless

(4月) (4日) (4日)

Background Organization Mapquest.com Examples

Background on the activity

- population parameter: proportion of continental US within 1 mile of a road
- relevant for conservation and land use planning
- hard to measure in population
- sampling is an attractive approach
- technology facilitates manual "data scraping" on the web

Introduction and motivation Data collection Analysis

Background

Organization Mapquest.com Examples

USGS project



Distance to Nearest Road in the Conterminous United States

A New Dataset

The USGS Geographic Analysis and dominoring (GAM) program has, developed a mational, high resolution dataset that gives the distance to the mearest road every 30 uncerts across the conterminous 48 states. This work provides the first unfield antical picture of roadless space, vehicular accessibility, and intensity of road construction.

The new dataset is the front member of the National Overview Road Metrics (NORM) family of road related indicators. This indicators measures straight-line or Euclidean distance (ED) to the nearest many and a give the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED datas can be immorphilms or the compound name NORM ED. NORM ED. And the compound name NORM ED. NORM ED. NORM ED. And the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name of the compound name of the compound strains of the compound name o

The North American Road Network

The road network of the United States is one of the Lunger human constructions on Earth. It consists of more than 4 million mile of mapped roads, plus many additional utility roads, 4-wheel-drive trails, and priv are rores. The documented roads and their rights-of-way occupy approximately 16 of the land area of the United States, roughly the area of South Carolina.

Roads are the circulatory system of our culture. They are used to bring raw materials to processing sites, to distribute processed goods, and to carry people to the significant size of roads is reflected in the significant size of the cosonic sectors—energy, automotive manufacturing, mining, and construction, among others—that support their building and tuse.

The U.S. road network is little studied as an integrated object. Spatial relationships between the network and intervening roadies areas are important to ecological and hydrobigical resources. The NORM indicators provide basic descriptions of the association of roads with their surroundings. NORM ED, in particular, focuses not on the characteriories of the road network itself, bat rather on the extent of spaces between roads.

The National Distance to Road Image

Properties of the Image

The background on this page is an image of average values of distance to road (DTR) for cells measuring 1,020 m (0.63 miles, nominally) 1,km) on each side; 7,5 million 1-km cells are displayed. Each cell averages 1,156 DTR values from the full-escolation 30m diatest: The same image is reproduced in more vivid color on page 2.



NONN-LO I-siminate image of southern colorisans. Bates Relates in the velocity patch is the nonlinear control and the southern present patch north of New Divisions present patch north of New Divisions. The Mississippi Data astends to the southerst. The barrier laiders stretching northeast and southwest from the data are some of the contemporate born reads in the contempora

intervening roadless areas are important to Patterns of Open Space and Road Density

Area of lowest distance to road (highest road darwisy appear in yellow, Mori low DTR areas are in cities, but here are exceptions. For example, energy extraction activities have developed druss and networks in the ol and gas fields of West Texas and the Texas Paulandle; these appear as yellow areas in anothtor adjustment to the texas of the order and the second second second second second second second to adjust and the second second second second second second the second second second second second second second second the city of Rio Rancho.

Molecited by the D14 (moleculed ying) conductors typeling occur in arrays where trains and vegetation are not impediments to conditionity special where there is motivation—such as agriculture—for making lum hulps) accessible. This areas prominent across the Great Planes, along the Shark Royer Plane in Idahay in the Central and Imperial Wileys of Californius, and to the west of the Cacade Montanian Scholmed, consider of its two politics, the Scholmed, consider of its two politics, the

High DTR (low road density) is represented in shades of blue-green or torquoise. The alternating valleys and ridges of the Appalachian Mountains create a pattern of blue (valleys) and turquoise (ridges). A broad swath of blue-steen covers much of the arid lands of the West, from the sand hills of Nebraska to the deserts of Arizona, New Mexico, Nevada, and southeastern California. Here arricultural productivity is low, and economic motivation for building a dense road network is generally lacking. Across the Interior West, where higher road densities (blue or yellow) occur, there is an association with water availability for agriculture (along the Rio Grande in New Mexico, for example), natural resource extraction, or dense

Shades of green represent areas remote from roads. Most of these occur because of severe accessibility issues. Steep slopes

Nicholas J. Horton

(Rocky Mountains, Sierra Nevada), swamps (southern Florida and Louisiana), and in some places climate (northern Maine and Minnesota), have made road building difficult and expensive. Many of these places are preserved as National Parks (Yellowstone, Everplacke) and Wilderness Areas. Nationally, these roadless areas are scaree, and hey occur perforentially in the West.

Applications Environmental Assessment

Roads and traffic affect natural resources in dozens of ways. Among these are elimination of forear earnyy, elevation of temperature, introduction of vehicular noise and pollution, diversion and concentration of natural drainage, production of data, introduction of imasive species, and collision of vehicular with animals large and small. Roads also serve as the primary mechanism for convergence of humans into the landscope.



Full-resolution NORM ED image of Sicux Falls, South Dakota. Light lines are boundaries of 1,020-m cells, the unit of avarraging for the national image. The 1-mile section-line read grid is visible occided the city. Interstate 90 runs east-west just above image center.

initiation and extinction of free, construction of dwelling, introduction of domestic animals, and building of additional reads. It has been estimated that reads ecologically affect 22% or more the land area of the conterminous United States. Because the effects of roads extend bycond their rights-d-way, a distance-do-road mesare is particularly helpful as estimating the lateral areach and areal extent of ecological and hydrological effects of roads.

with consequent resource extraction

Imposed Iggeneration of the Indicace pic spectrally deriminents to eccolopical integrity. NORM ED measures the second pick of the indication pick and information types, including natural fingmentation. Recause roads are the most common source of human-indiced fingmentation. NORM ED provides a resource for studies of human impacts on a nutural scale and a basis for comparing landscape patterns manipulated by humans, the actural patterns.

Land Use and Land Cover Research

In our society, human presence and vehicular access by road are tightly coupled. New roads often are built to support new land user. As the road network changes, so does the moult of intervening roadies squees. Scientific and/ of the processes of road-advourt coupling to almospheric and counterconditions, is just beginning. Their and/ way provide valuable insights into environmental challenges that may lie atend.

Source Data and its Limitations

The NORM ED dataset is derived from the Bureau of Transportation Statistics/ Geographic Data Technology (BTS/GDT) roads dataset, which in turn was derived from the Bureau of Census TIGER files for the 2000 census. The origins of the data range from pre 1990 USGS quadrangle maps at 1:100.000-scale to recent datasets built using highly accurate Global Positioning System technology Because the data have such mixed origins, they cannot be interpreted as uniform in resolution, quality, or are. Nevertheless, this is the most current dataset publicly available that describes the road network of the United States

Values Over Water

The downlandble NORM ED dataset indicato DR values over takes and offshore. Over the occans and Great Lakes, DR was colculated to as range of 60 km, wide extended rangers where the preservoir advess in or 4, particular values for water areas that are outside preservoir advess on or 4, particular values for water areas that are outside meas are occans, the Great Lakes, and various estaturize. Other water areas, such as Unit's Great Salt Lake, full within a Unit's Great Salt Lake, full within a Unit's Great Salt Lake, full within a Unit's Great Salt Lake, full within DR colones.

More Information

For more information on NORM ED, contact:

Raymond D. Watts USGS Fort Collins Science Center 2150 Centre Ave Bdg C Fort Collins, CO 80526-8118 e-mail: rwatts@usg.gov phone: 970-226-9378

0 Q (?

What proportion of the U.S. is within a mile of a road?

Background Organization Mapquest.com Examples

Organization

- students given handout (included on website) describing process
- work in groups of 2 (a la "pair programming") to proofread and check results
- instructor supplied R-code used to generate spreadsheet containing random latitudes and longitudes and framework for data entry
- students open two windows: one web browser and one for Excel
- variables to code: incontinent (0 or 1), within1mile (0 or 1), and location (character)

(日) (同) (三) (三)

Background Organization Mapquest.com Examples

R code

```
nsamp = 50
long = -runif(nsamp, min=65, max=130)
lat = runif(nsamp,min=25,max=50)
data = cbind(sample=1:nsamp,
   latitude=round(lat, 4),
   longitude=round(long, 4),
   incontinent=c(rep(NA, nsamp)),
   within1mile=c(rep(NA, nsamp)),
   location=character(nsamp),
   notes=character(nsamp))
write.csv(data,file="roadless.csv")
```

(人間) ト く ヨ ト く ヨ ト

Background Organization Mapquest.com Examples

Mapquest.com

- search window allows user to jump to a particular point by providing latitude and longitude
- can zoom in and out as appropriate to find where you are
- legend on bottom left provides scale (1 mile = 5280 feet)
- R used to generate spreadsheet containing random latitudes and longitudes and framework for data entry in Excel using code provided by instructor

< ロ > < 同 > < 回 > < 回 >

Background Organization Mapquest.com Examples

Example

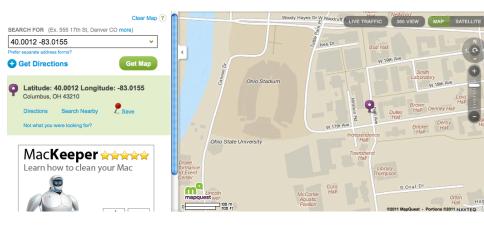
- Imagine that our first random location was 40.0012 -83.0155
- Is this within the continental US? If so, is it within a mile of a road?
- Let's cut and paste these values from our spreadsheet into Mapquest.

<ロト <部 > < 注 > < 注 >

э

Background Organization Mapquest.com Examples

Example 1: the Ohio State University Statistics Dept

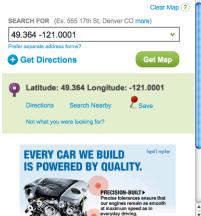


< 17 >

- ₹ 🖹 🕨

Background Organization Mapquest.com Examples

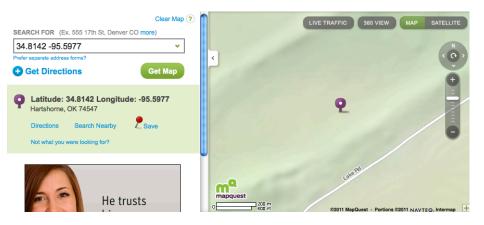
Example 2: British Columbia





Background Organization Mapquest.com Examples

Example 3: Oklahoma



< ロ > < 同 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ >

э

Overview R code Results

Analysis and deliverables

- students collect data from 50 samples
- students analyze results in R, calculating their group's interval estimate
- results get pooled for the class as a whole, yielding a smaller interval
- reinforces many important questions about design and estimation

伺 ト イ ヨ ト イ ヨ ト

Overview **R code** Results

Analyses of a sample of size 50

- > ds = read.csv("roadless.csv", stringsAsFactors=FALSE)
 > table(ds\$incontinent)
 0 1
- 22 28
- > table(ds\$location[ds\$incontinent==0])

Atlantic	Canada	Gulf of Mexico	Mexico
10	1	2	2
Pacific	water		
6	1		

・ 同 ト ・ ヨ ト ・ ヨ ト

э

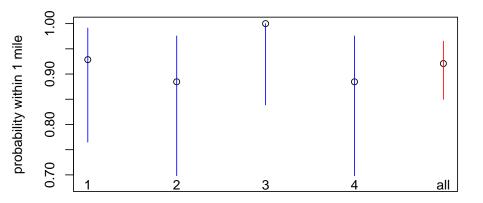
Overview **R code** Results

Analyses of a sample of size 50

```
> smallds = subset(ds, incontinent==1); rm(ds)
> table(smallds$within1mile)
0 1
2 26
> binom.test(26, 28)
Exact binomial test
data: 26 and 28
number of successes = 26, number of trials = 28, p-value =
alternative hypothesis: true probability of success is not
95 percent confidence interval:
 0.7649652 0.9912295
sample estimates:
probability of success
             0.9285714
                                    ・ロト ・得ト ・ヨト ・ヨト
```

Overview R code Results

Results from 4 groups (plus combined)



Discussion

- straightforward approach to estimation of an unknown population parameter
- hard to measure the true value
- the parameter is moderately interesting
- estimator is creative
- easy to implement in a single class (if taught in computer classroom)
- helps reinforce the use of technology in the course
- brings in many design questions (how do I measure a mile? Should unlabeled paths be included? What if I land in the middle of a 3 mile wide lake?)

- 4 同 6 4 日 6 4 日 6

Discussion Extensions Questions

Extensions

- can be done outside of class (if lab space not available)
- can audit student work to ensure that they are appropriately coding their locations
- students asked to summarize and assess assumptions used
- note that the world is not flat (duh!): nice connections to trig in terms of improving the sampling (see the rgeo() function within the mosaic package
- other ideas?

- 同 ト - ヨ ト - - ヨ ト

Discussion Extensions Questions

What proportion of the U.S. is within a mile of a road?

Nicholas J. Horton

Department of Mathematics and Statistics Smith College Northampton, MA

March 22, 2011

nhorton@smith.edu http://www.math.smith.edu/ \sim nhorton

4 3 5 4 3