

Winter Institute in Data Science

Ryan T. Moore

2021-01-02

Goals

Skills

Examples

Welcome!

- ▶ Political methodologist in Dept of Government in SPA

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Data Science

Particular intersection of

- ▶ Statistical practice
- ▶ Computational tools
- ▶ Substantive knowledge

- ▶ Stats: prediction (vs. explanation), algorithms (vs. models)

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- ▶ Computing: addressing problems with data *per se* (size, tidy-ness, un/structure, replicability)
- ▶ Substance: social science

Computers!

Data Scientist: The Sexiest Job of the 21st Century

by [Thomas H. Davenport](#) and [D.J. Patil](#)

From the October 2012 Issue

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Highest concentrations: DC, WA, MD, VA, IL!

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...and salaries are high ...

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- ▶ Do original research using data sci methods.
Contribute methods, substance, both.

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 - ▶ text as data

Examples

What is a data science task?

“Keep only non-voters who might be subject to interference”

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```
social <- read_csv("http://j.mp/2Et71U0")  
filter(social, (hhsiz > 1) & (primary2004 == 0))
```

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```
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```

```
## # A tibble: 161,275 x 6
```

##	sex	yearofbirth	primary2004	messages	primary2004
##	<chr>	<dbl>	<dbl>	<chr>	<dbl>
##	1 male	1941	0	Civic Duty	0
##	2 female	1947	0	Civic Duty	0
##	3 male	1951	0	Hawthorne	1
##	4 female	1950	0	Hawthorne	1
##	5 female	1982	0	Hawthorne	1
##	6 male	1981	0	Control	0
##	7 female	1959	0	Control	1
##	8 male	1956	0	Control	1
##	9 female	1968	0	Control	0
##	10 male	1967	0	Control	0

```
## # ... with 161,265 more rows
```

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```
parse_date("15 enero 2000",  
           locale = locale("es"),  
           format = "%d %B %Y")
```

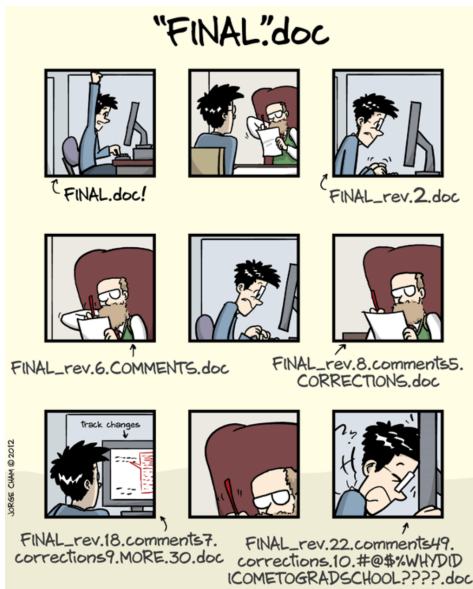
```
## [1] "2000-01-15"
```


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```
git add paper.tex
```

```
git commit paper.tex
```

```
git push
```

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- ▶ Are intersections with new patterns less prone to traffic accidents?
- ▶ How do we compare models/prediction strategies?

Course GitHub page:

<https://github.com/ryantmoore/winter-inst-2022>

(syllabus tour)

Installations

- ▶ R:
<https://cran.r-project.org>
- ▶ RStudio (Desktop):
<https://rstudio.com/products/rstudio/>
- ▶ Anaconda:
<https://www.anaconda.com/distribution/>