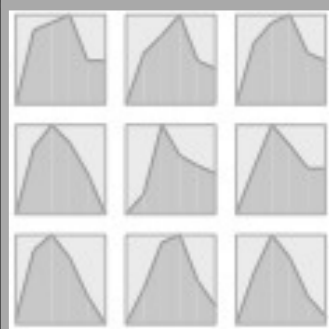
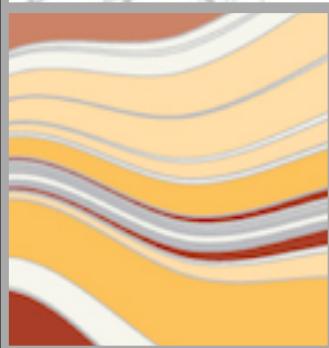
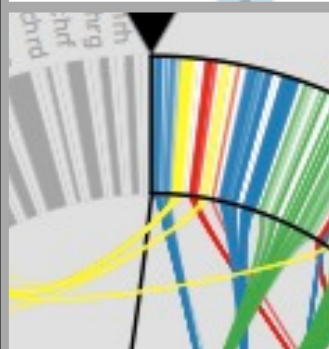
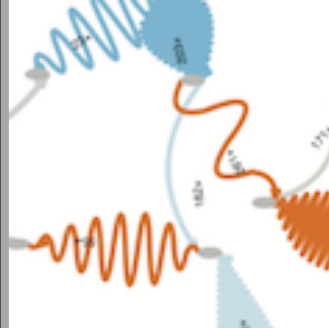


cs6964 | Jan 10 2012

# INFORMATION VISUALIZATION

Miriah Meyer  
*University of Utah*



cs6964 | Jan 10 2012

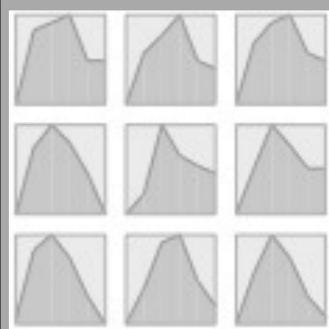
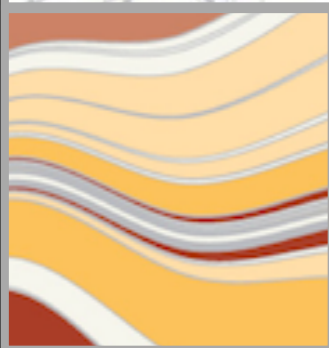
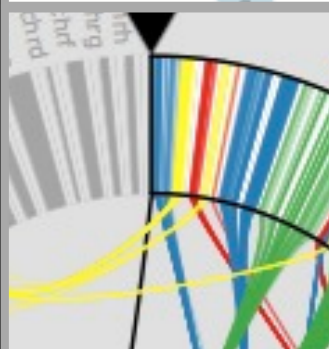
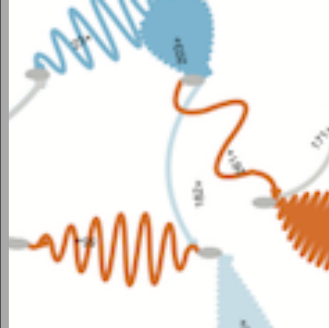
# INFORMATION VISUALIZATION

Miriah Meyer  
*University of Utah*

*slide acknowledgements:*

Hanspeter Pfister, Harvard University

Jeff Heer, Stanford University



-WHAT

-WHY

-WHO

-HOW

-WHAT

-WHY

-WHO

-HOW



# data

data  
government

SHAKESPEARE  
QUARTERLY

# INDUSTRIAL REVOLUTION OF DATA

Joe Hellerstein, UC Berkley, 2008



HOW MUCH DATA IS THERE?

**2010: 1.2 zetabytes**

**2011: 1.8 zetabytes**

*zetabyte  $\approx$  1,000,000,000,000,000,000,000,000 or  $10^{24}$*

*200x all words ever spoken by humans*

**9x increase over 5 years**

The ability to take data—to be able to **understand** it, to **process** it, to **extract value** from it, to **visualize** it, to **communicate** it—that's going to be a hugely important skill in the next decades, ... because now we really do have essentially free and ubiquitous data. So the complimentary scarce factor is the ability to understand that data and extract value from it.

Hal Varian, Google's Chief Economist  
The McKinsey Quarterly, Jan 2009



COGNITION IS LIMITED



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# The "Door" Study

profsimons Subscribe 10 videos



Like Add to Share 260,166

Uploaded by profsimons on Mar 13, 2010  
This video shows footage from a 1998 study by Daniel Simons and Daniel Levin in which a participant fails to notice when the person he is talking to is replaced by someone else. The study was among the first to demonstrate that the phenomenon of "change blindness" can occur outside the laboratory.  
[Show more](#)

### Top Comments

This explains a lot about one of my ex-boyfriends. "If it looks like a girl, and it feels like a girl, and it smells like a girl, and it acts like a girl... it must be my girlfriend."  
ataaah 1 year ago 141

**Change Blindness 1**  
by yeblind  
36,759 views  
0:22  
Featured Video

**Gradual Change Test 1**  
by profsimons  
34,443 views  
1:20

**Change Blindness**  
by trutapes  
25,498 views  
5:57

**Test Your Awareness.....**  
by beepsquik  
43,847 views  
1:34

**Perception of beauty**  
by andreic27  
92,589 views  
1:14

**Amazing Fire & Gas Trick!**  
by brusspup  
1,078,932 views  
1:20

**Try To Watch This Without Laughing Or**  
by 88ownsnascar  
2,042,315 views  
1:15

**How much is: 75 + 26**  
by Daanando  
213,997 views  
1:29

**Awareness Test**  
by JOEKthePANDA

MTHIVLWYADCEQGHKILKMTWYN  
ARDCAIREQGHVLMFPSTWYARN  
GFPSVCEILQGKMFPNSDRCEQDIFP  
SGHLMFHKMVPSTWYACEQTWRN

MTHI**V**LWYADCEQGHKILKMTWYN  
ARDCAIREQGH**L**KMFPSTWYARN  
GFPS**V**CEILQGKMFPSNDRCEQDIFP  
SGHLMFHKM**V**PSTWYACEQTWRN

# VISUALIZATION ...

1) uses perception to free up cognition

MEMORY IS LIMITED

calculation exercise ...

$$\begin{array}{r} 34 \\ \times 28 \\ \hline \end{array}$$

calculation exercise ...

$$\begin{array}{r} 79 \\ \times 16 \\ \hline \end{array}$$



# VISUALIZATION ...

- 1) uses perception to free up cognition
- 2) serves as an external aid to augment working memory

# vi · su · al · i · za · tion

*noun, plural -s*

- 1) formation of mental visual images
- 2) the act or process of interpreting in visual terms or of putting into visible form

“The use of computer-generated, interactive, visual representations of data to amplify cognition.”

[Card, Mackinlay, & Shneiderman 1999]

-WHAT

-WHY

-WHO

-HOW

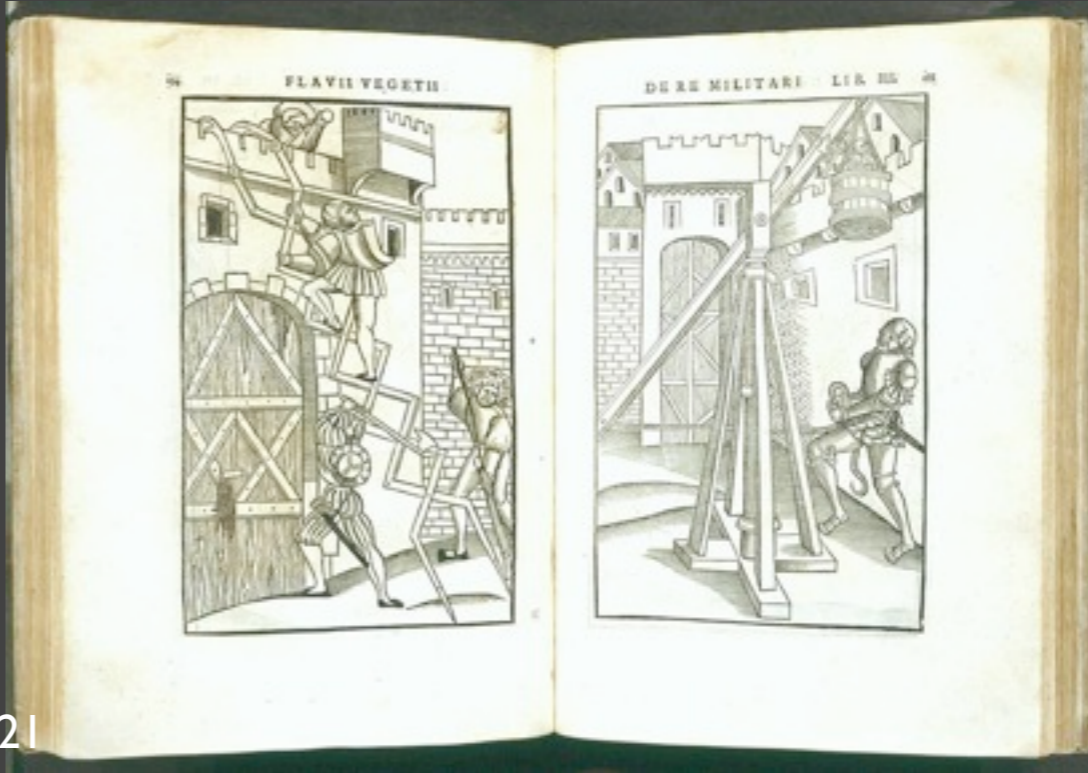
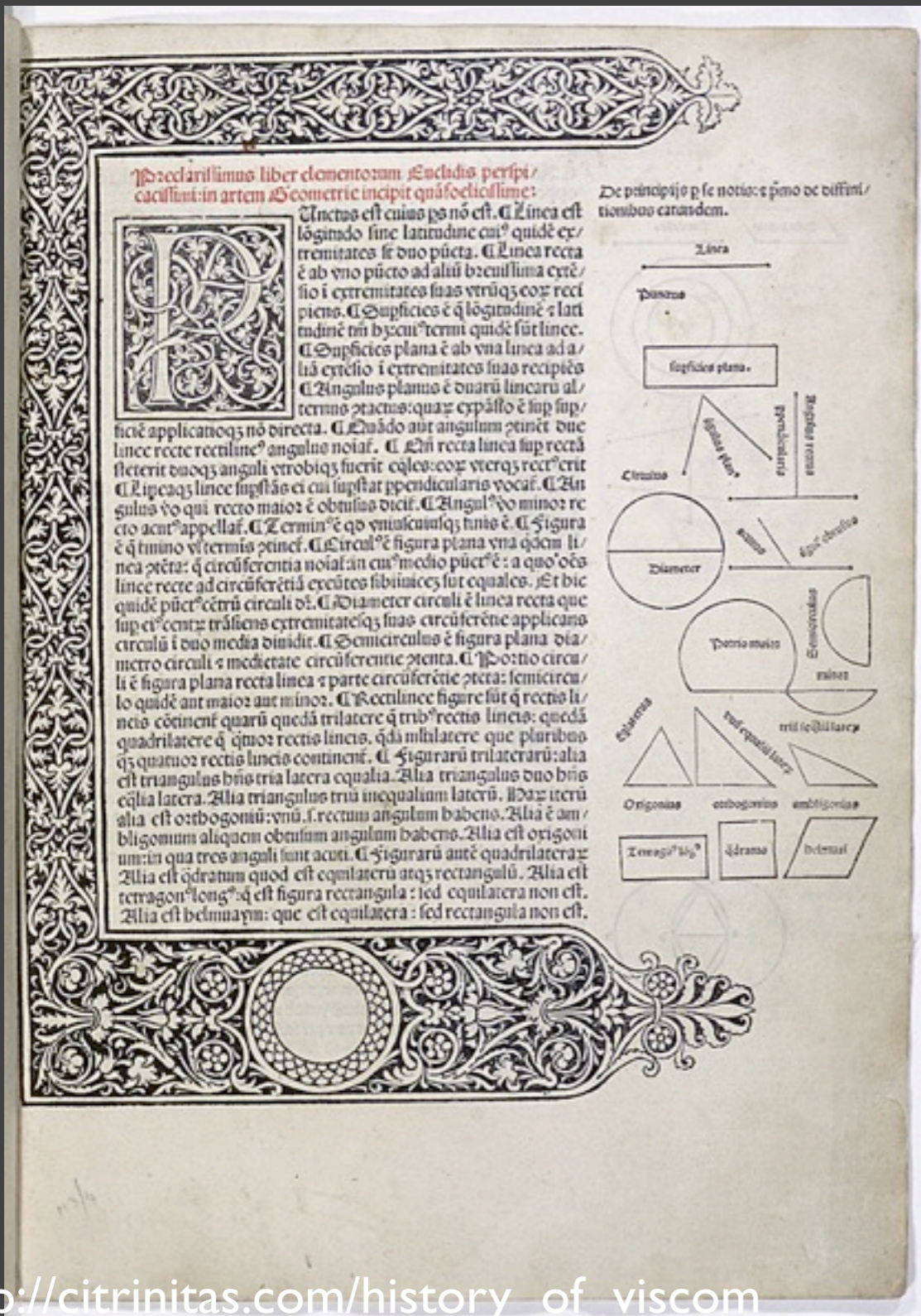
# “It is things that make us smart”

Donald Norman



# “It is things that make us smart”

Donald Norman





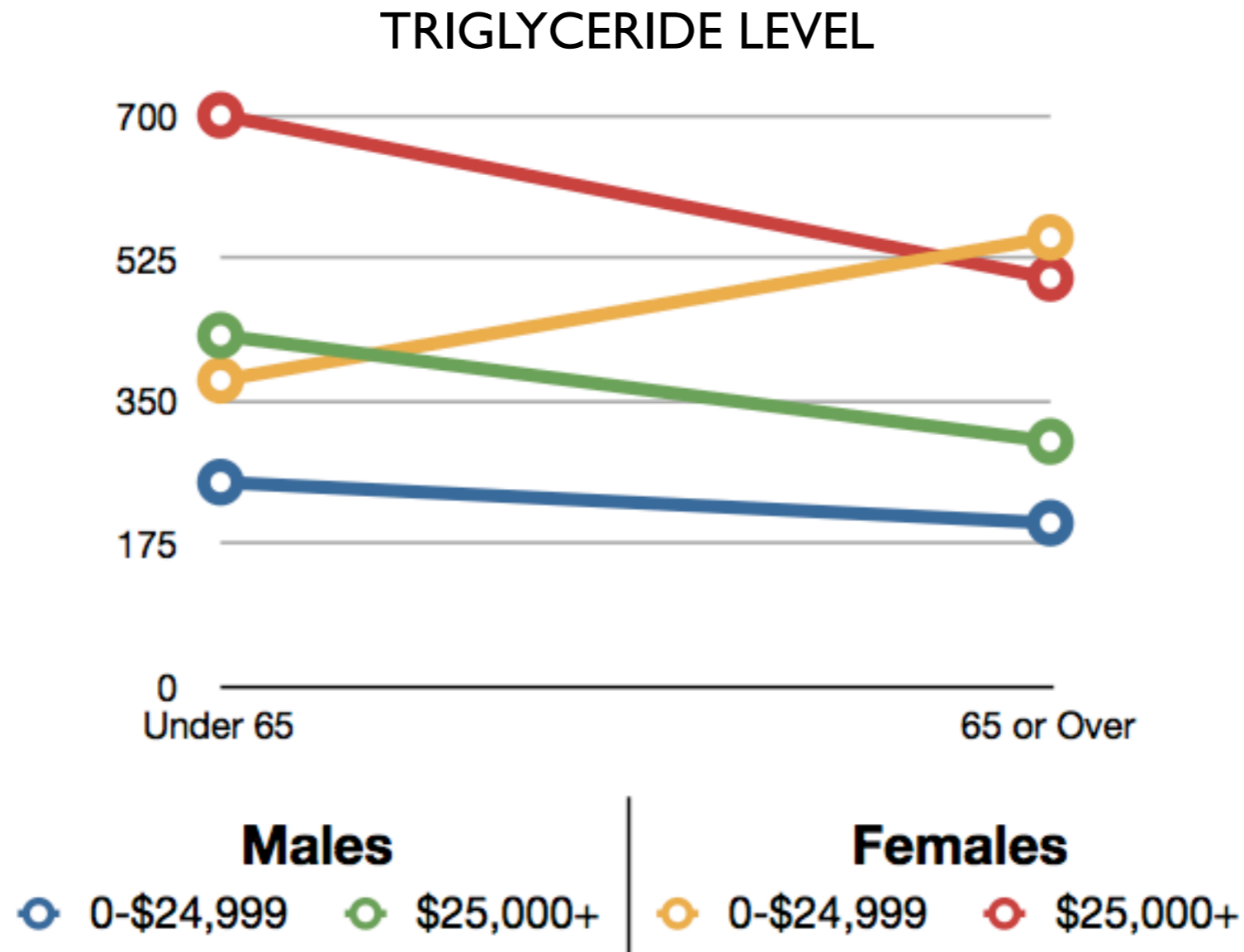
# query exercise ...

## TRIGLYCERIDE LEVEL

Income Group	Males		Females	
	Under 65	65 or Over	Under 65	65 or Over
0-\$24,999	250	200	375	550
\$25,000+	430	300	700	500

### QUESTION:

Which gender and income level shows a different effect of age on triglyceride levels?



**QUESTION:**

Which gender and income level shows a different effect of age on triglyceride levels?



# Why do we create visualizations?

- answer questions
- generate hypotheses
- make decisions
- see data in context
- expand memory
- support computational analysis
- find patterns
- tell a story
- inspire

# VISUALIZATION GOALS

- record** information

- analyze** data to support reasoning

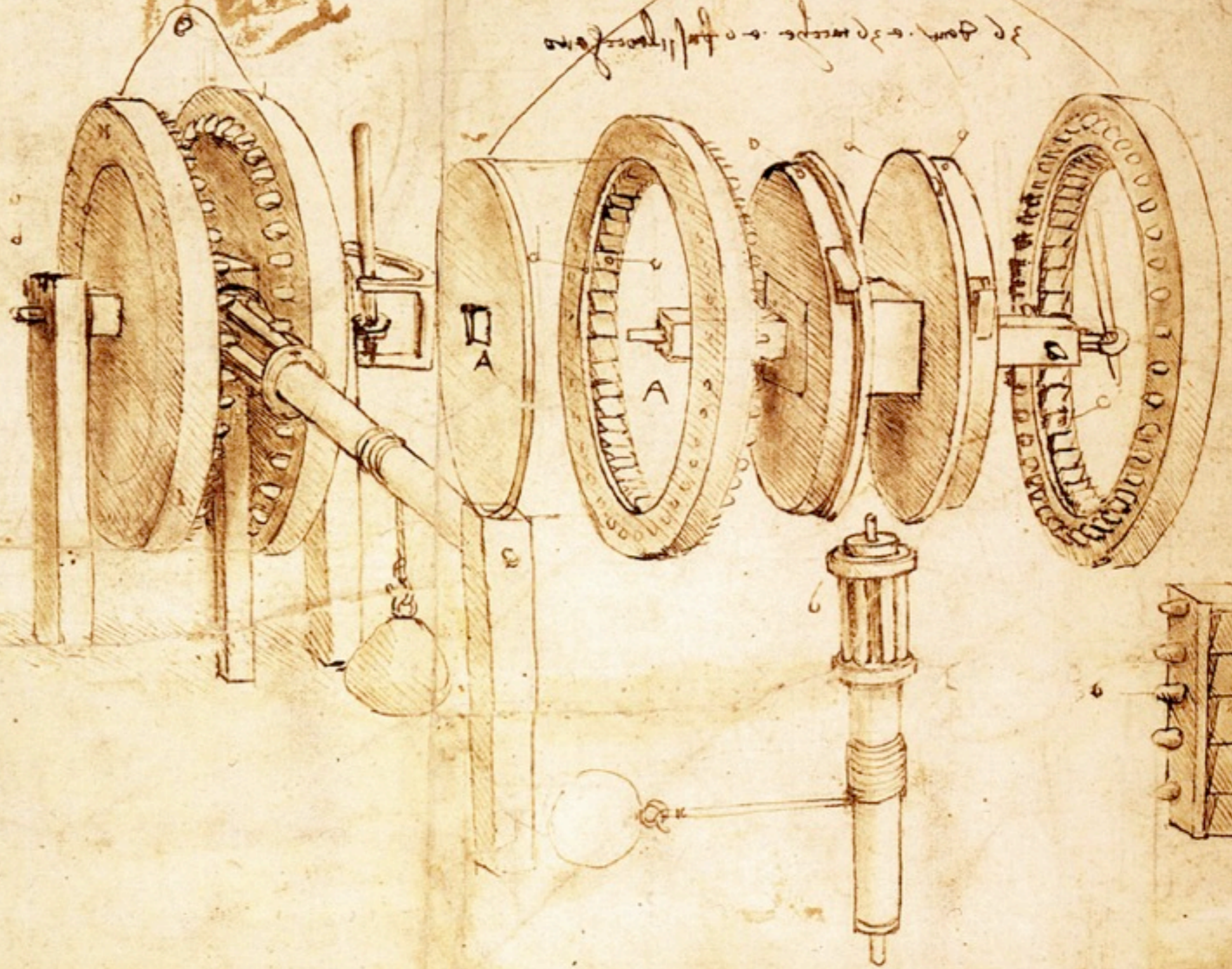
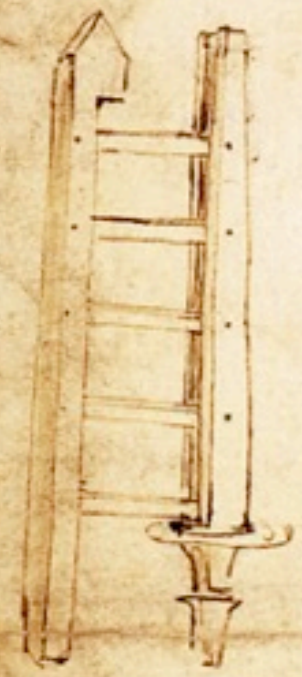
- confirm** hypotheses

- communicate** ideas to others

# RECORD INFORMATION

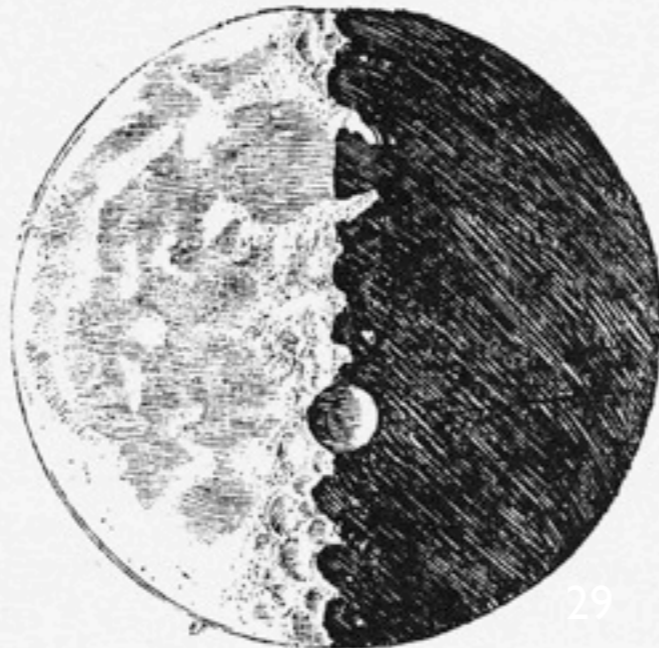
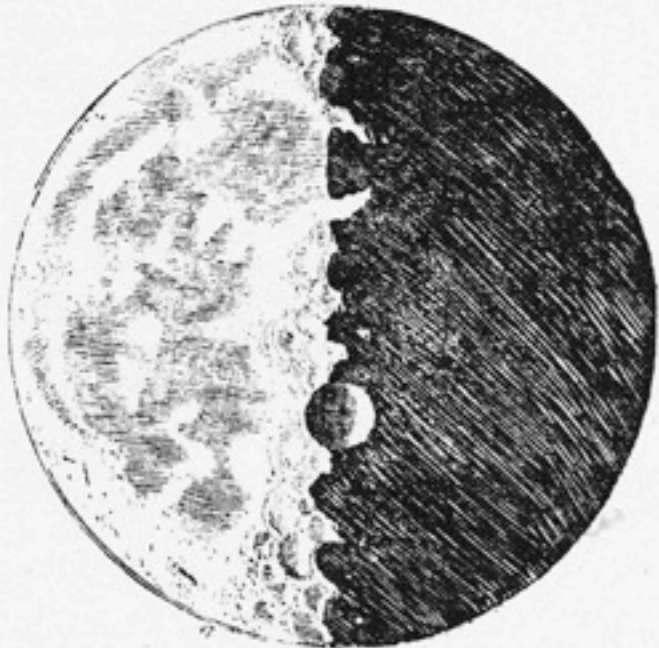
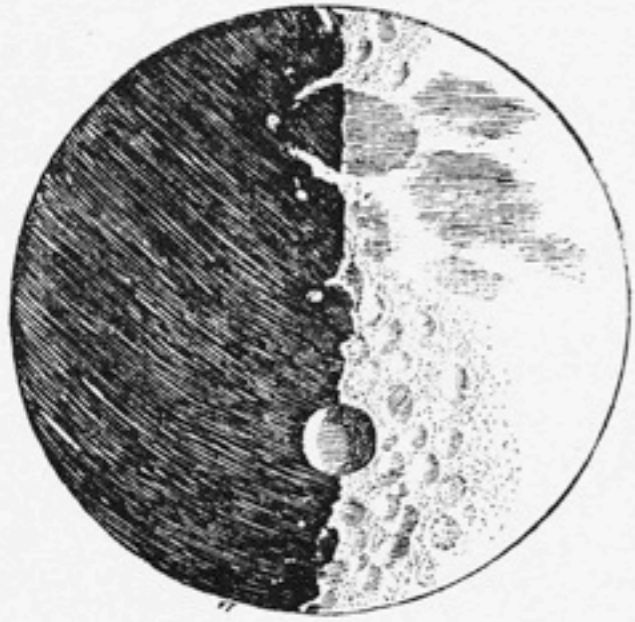
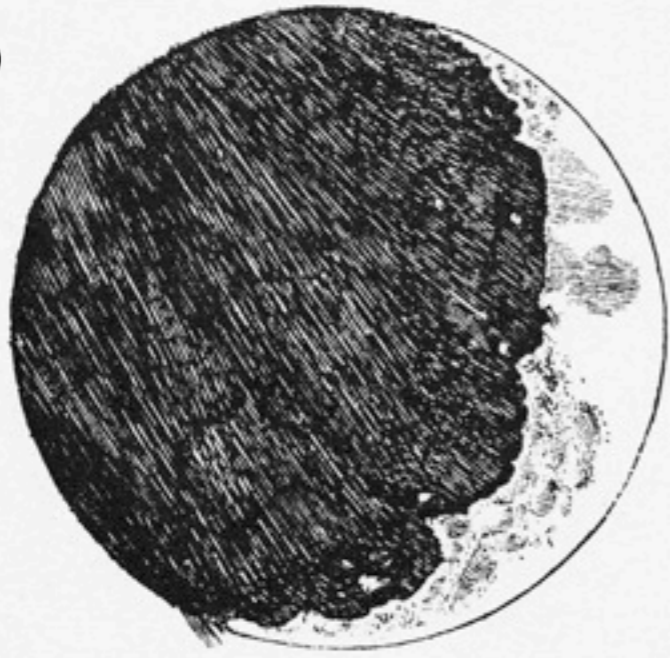


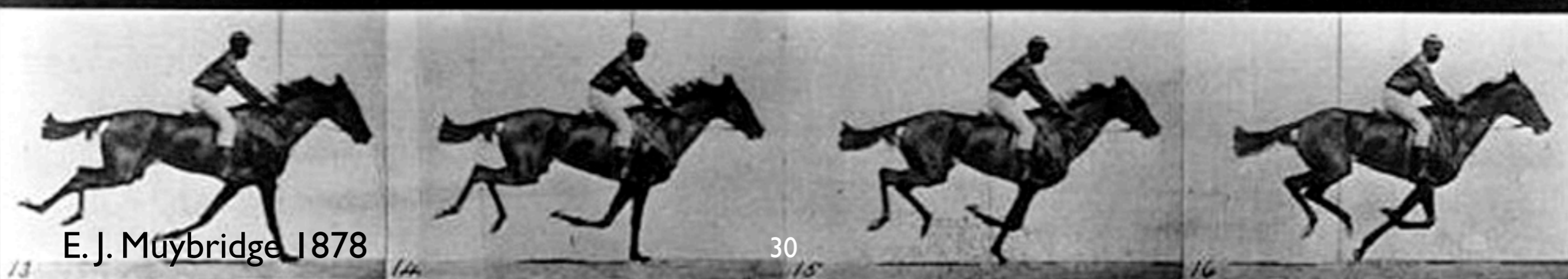
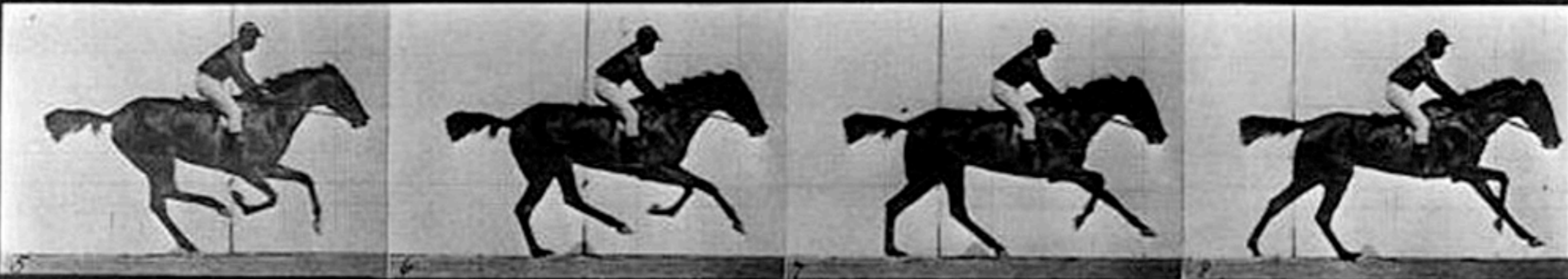
3e part. de la machine de la poudre



Leonardo da Vinci 1485

Galileo 1610





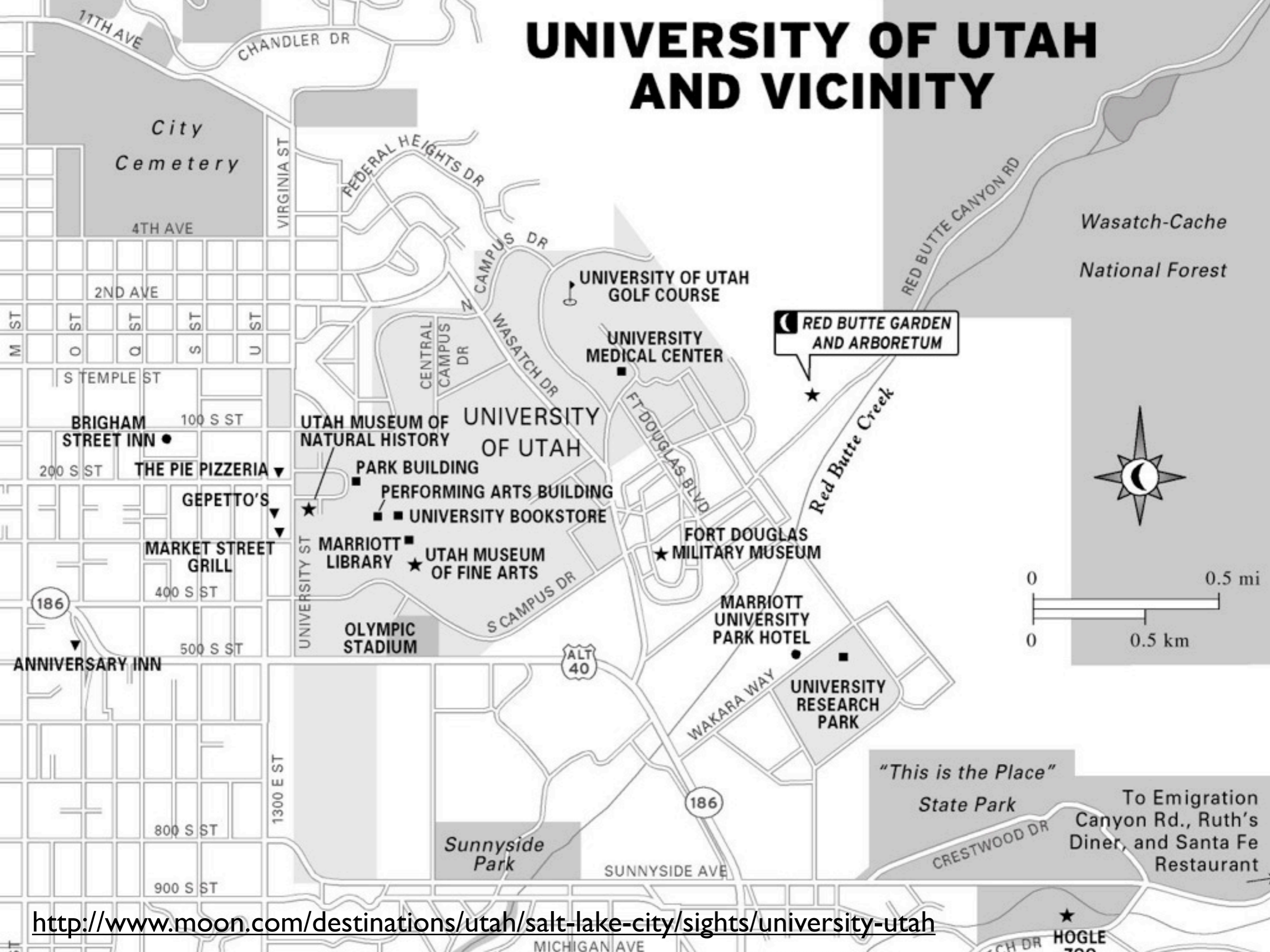
E. J. Muybridge 1878

30



Anne Rempel and Jonathan Barrera 2011

# UNIVERSITY OF UTAH AND VICINITY





**ANALYZE DATA**

# THE CHALLENGER DISASTER



HISTORY OF O-RING DAMAGE ON SRM FIELD JOINTS

1167  
Oct 30, 1985

SRM No.	Cross Sectional View			Top View		Clocking Location (deg)
	Erosion Depth (in.)	Perimeter Affected (deg)	Nominal Dia. (in.)	Length Of Max Erosion (in.)	Total Heat Affected Length (in.)	
61A LH Center Field**	None	None	0.280	None	None	36° -- 66°
61A LH CENTER FIELD**	NONE	NONE	0.280	NONE	NONE	338° -- 18°
51C LH Forward Field**	0.010	154.0	0.280	4.25	5.25	163
51C RH Center Field (prim)***	0.038	130.0	0.280	12.50	58.75	354
51C RH Center Field (sec)***	None	45.0	0.280	None	29.50	354
41D RH Forward Field	0.028	110.0	0.280	3.00	None	275
41C LH Aft Field*	None	None	0.280	None	None	--
41B LH Forward Field	0.040	217.0	0.280	3.00	14.50	351
STS-2 RH Aft Field	0.053	116.0	0.280	--	--	90

\*Hot gas path detected in putty. Indication of heat on O-ring, but no damage.  
 \*\*Soot behind primary O-ring.  
 \*\*\*Soot behind primary O-ring, heat affected secondary O-ring.

Clocking location of leak check port - 0 deg.

OTHER SRM-15 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY AND NO SOOT NEAR OR BEYOND THE PRIMARY O-RING.

SRM-22 FORWARD FIELD JOINT HAD PUTTY PATH TO PRIMARY O-RING, BUT NO O-RING EROSION AND NO SOOT BLOWBY. OTHER SRM-22 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY.

BLOW BY HISTORY

SRM-15 WORST BLOW-BY

- o 2 CASE JOINTS (80°), (110°) ARC
- o MUCH WORSE VISUALLY THAN SRM-22

SRM 22 BLOW-BY

- o 2 CASE JOINTS (30-40°)

SRM-13A, 15, 16A, 18, 23A 24A

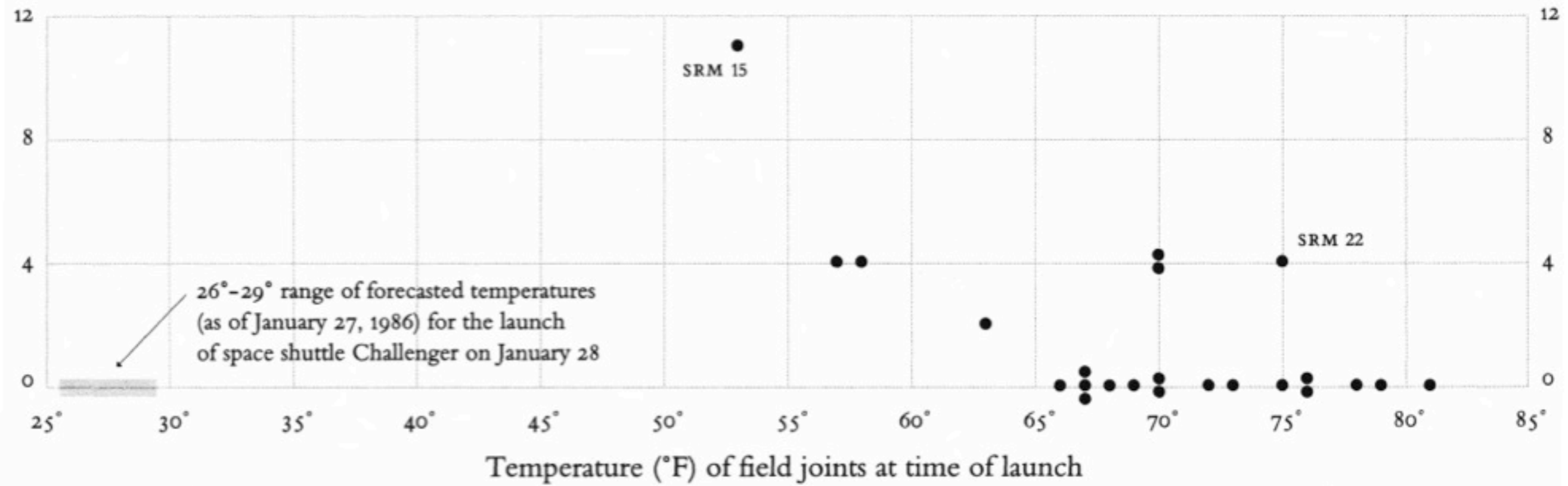
- o NOZZLE BLOW-BY

HISTORY OF O-RING TEMPERATURES (DEGREES - F)

	<u>MOTOR</u>	<u>MGT</u>	<u>AMB</u>	<u>O-RING</u>	<u>WIND</u>
DM-4		68	36	47	10 MPH
DM-2		76	45	52	10 MPH
QM-3		72.5	40	48	10 MPH
QM-4		76	48	51	10 MPH
SRM-15		52	64	53	10 MPH
SRM-22		77	78	75	10 MPH
SRM-25		55	26	29	10 MPH
				27	25 MPH

# DECISION MAKING

O-ring damage index, each launch



# DATA IN CONTEXT



John Snow 1854

**Google offers** beta  
 Deals on the great places to eat, shop, and play in Salt Lake City.  
[Sign up now](#)  
 Advertise on NYTimes.com

Published: January 8, 2010  
**A Peek Into Netflix Queues**  
 Examine Netflix rental patterns, neighborhood by neighborhood, in a dozen cities. Some titles with distinct patterns are Mad Men, Obsessed and Last Chance Harvey. [Comments \(135\)](#)

100 titles that were frequently rented from Netflix in 2009  
 Change how movies are sorted  
 Most rented | Alphabetical | By metacore  
 < Previous | Next > | Most rented | Least rented

**Seven Pounds**

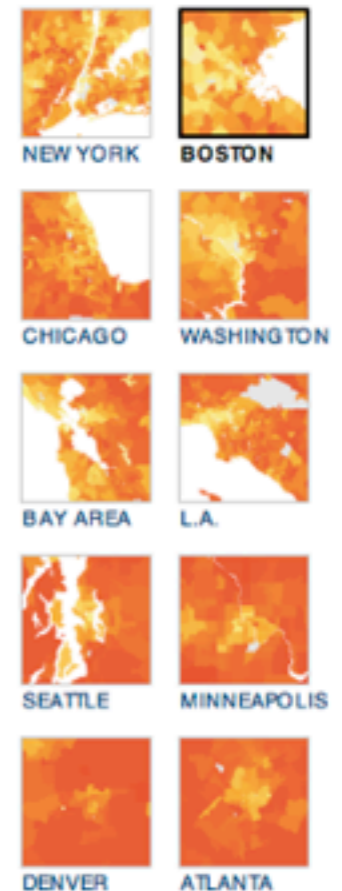
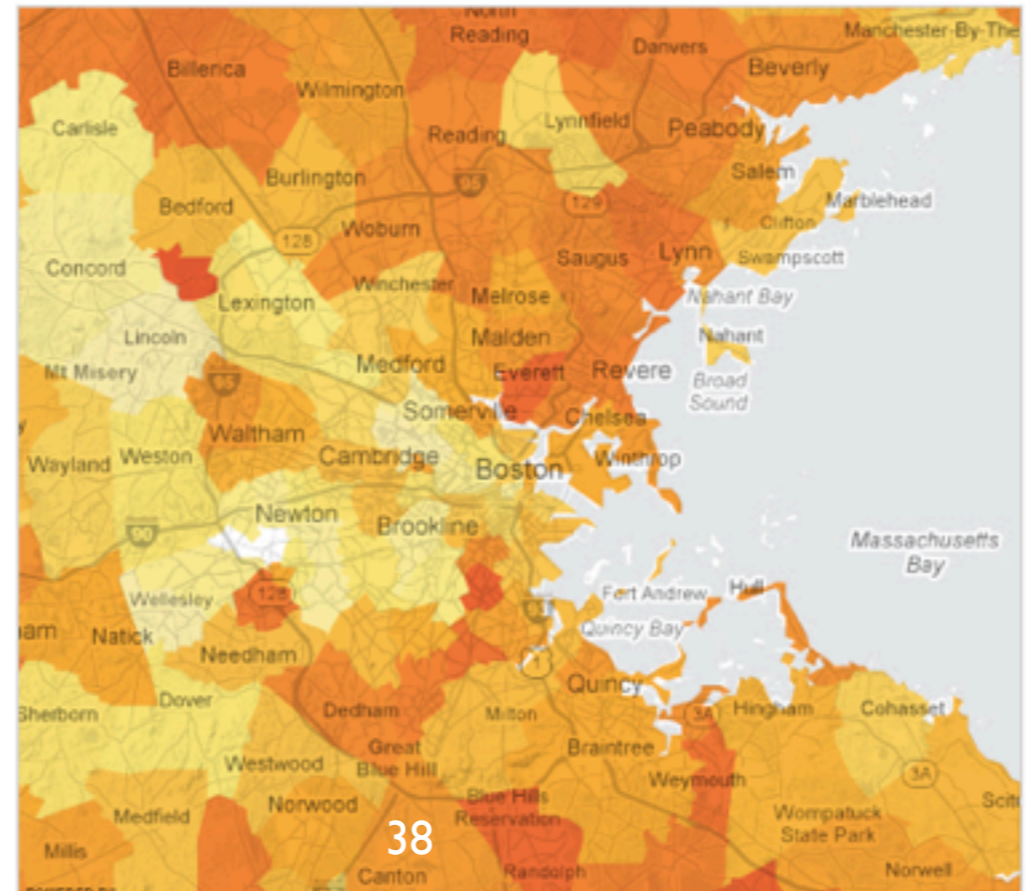


**36**  
 Metacritic score  
 100=loved by critics, 0=hated

"Seven Pounds," which reunites Will Smith with Gabriele Muccino (who directed him in "The Pursuit of Happyness"), begins with a series of riddling, chronologically scrambled scenes. A man calls 911 to report his own suicide. He badgers a blind call-center employee — whom we suspect will be a significant character, since he's played by Woody Harrelson — with complaints and insults. He embraces a lovely woman in an even lovelier beach house. He visits a nursing home where he terrorizes an administrator and comforts a resident.

[Read Rest of NYT Review >](#)

The ZIP codes are shaded according to each movie's rank. **Ranked No. 1** **No. 50**



# REVEAL PATTERNS

How Different Groups Spend Their Day - Interactive Graphic - NYTimes.com

http://www.nytimes.com/interactive/2009/07/31/business/20080801-metrics-graphic.html?scp=1&... Google

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## How Different Groups Spend Their Day

The American Time Use Survey asks thousands of American residents to recall every minute of a day. Here is how people over age 15 spent their time in 2008. [Related article](#)

### People ages 25 to 64

About 75 percent of this group -- including two-thirds of women -- is employed.

Everyone	Employed	White	Age 15-24	H.S. grads	No children
Men	Unemployed	Black	<b>Age 25-64</b>	Bachelor's	One child
Women	Not in lab...	Hispanic	Age 65+	Advanced	Two+ children

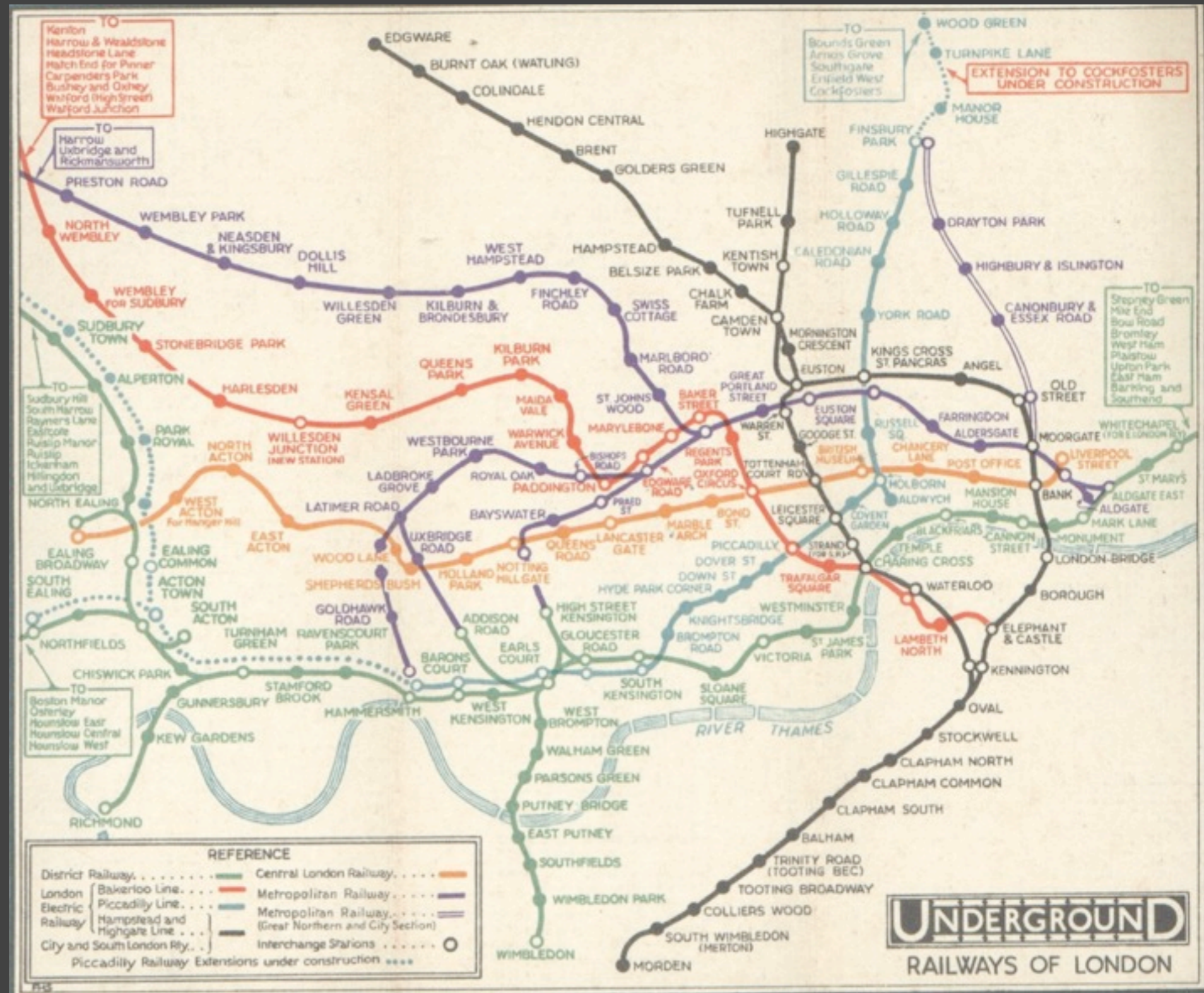
100% 80% 60% 40% 20% 0%

6 a.m. 9 a.m. Noon 3 p.m. 6 p.m. 9 p.m. Midnight 3 a.m.

Labels: Eating and..., Work, Household activities, Traveling, TV and movies, Socializing, Sleeping

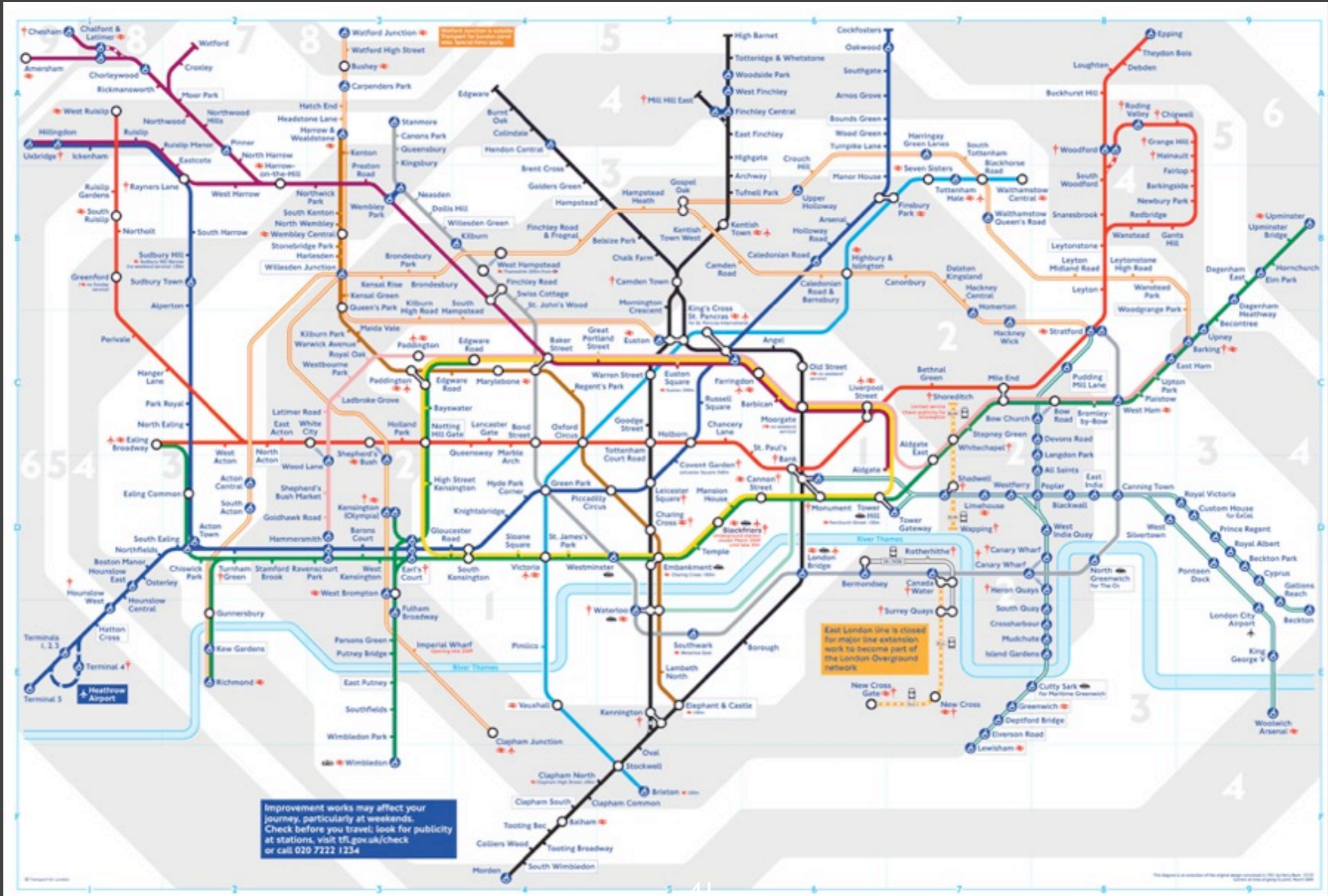
By SHAN CARTER, AMANDA COX, KEVIN QUEALY and AMY SCHOENFELD | [Send Feedback](#)

# ABSTRACT

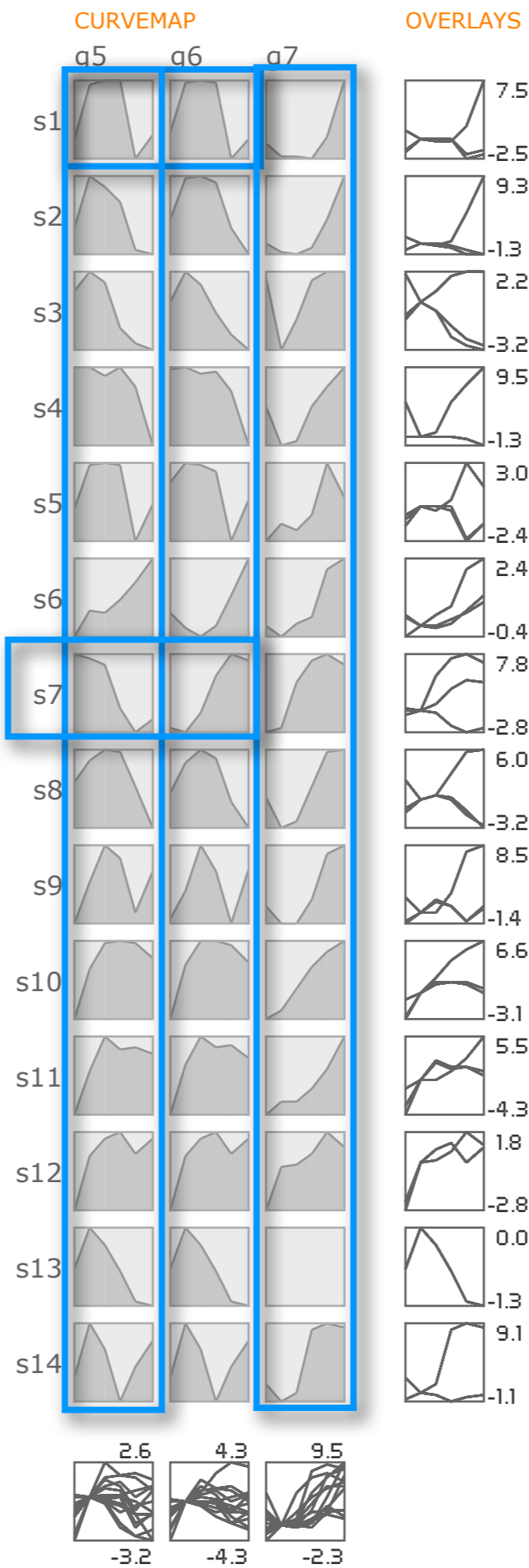
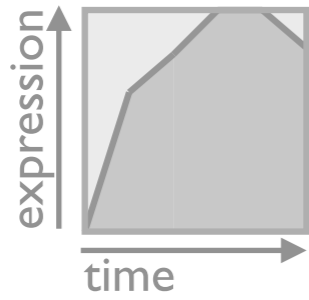




# ABSTRACT



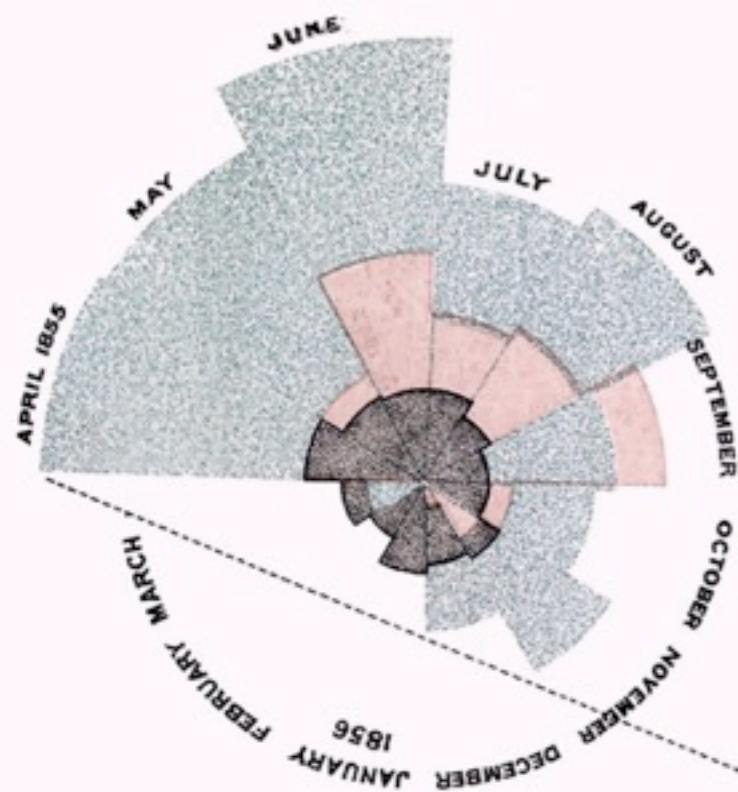
CONFIRM HYPOTHESES



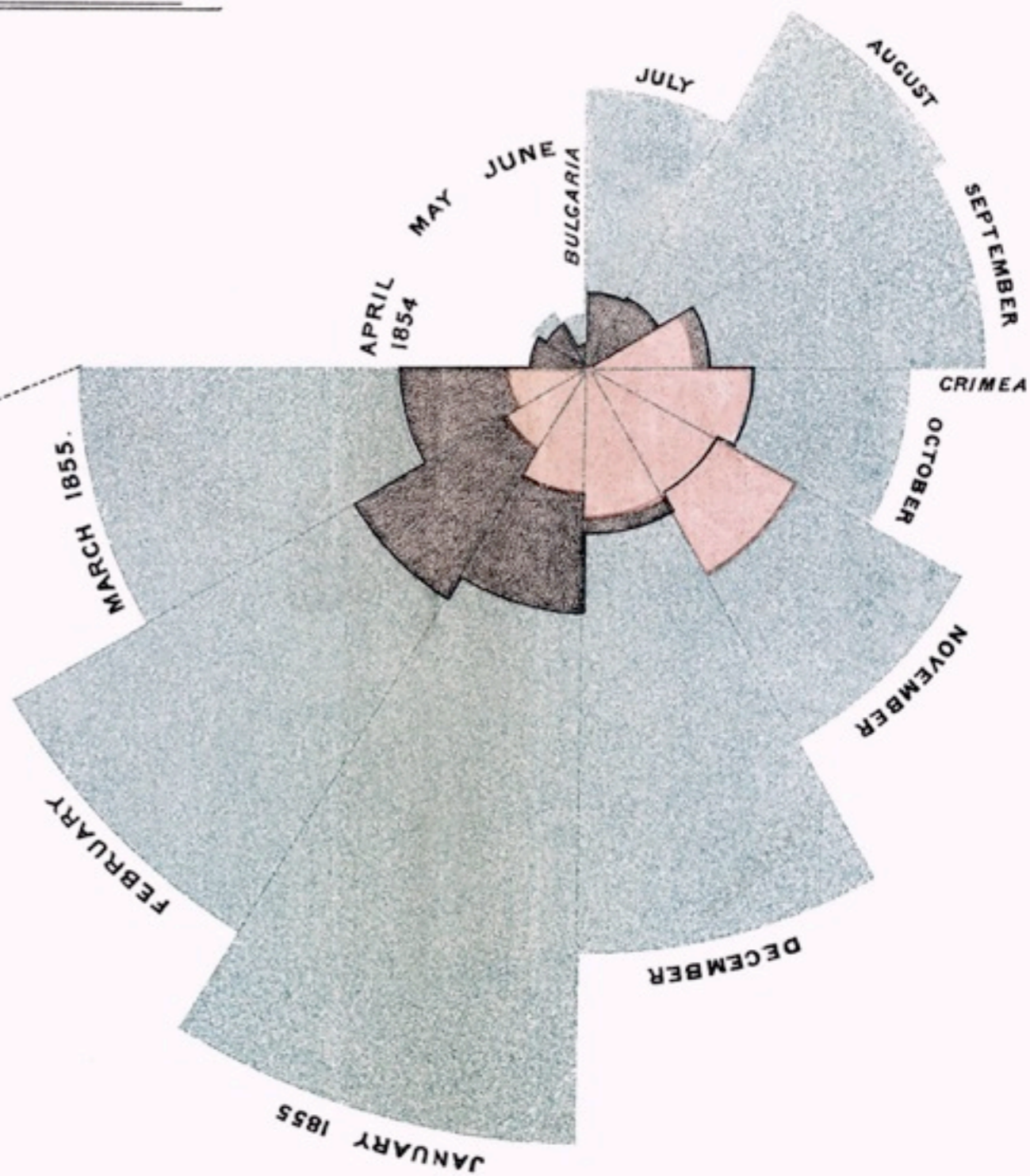
COMMUNICATE IDEAS

# DIAGRAM OF THE CAUSES OF MORTALITY IN THE ARMY IN THE EAST.

2.  
APRIL 1855 TO MARCH 1856.



1.  
APRIL 1854 TO MARCH 1855.



*The Areas of the blue, red, & black wedges are each measured from the centre as the common vertex.*

*The blue wedges measured from the centre of the circle represent area for area the deaths from Preventible or Mitigable Zymotic diseases; the red wedges measured from the centre the deaths from wounds; & the black wedges measured from the centre the deaths from all other causes.*

*The black line across the red triangle in Nov<sup>r</sup> 1854 marks the boundary of the deaths from all other causes during the month.*

*In October 1854, & April 1855; the black area coincides with the red; in January & February 1856, the blue coincides with the black.*

*The entire areas may be compared by following the blue, the red & the black lines enclosing them.*

# Carte Figurative des pertes successives en hommes de l'Armée Française dans la campagne de Russie 1812-1813.

Dessinée par M. Minard, Inspecteur Général des Ponts et Chaussées en retraite. Paris, le 20 Novembre 1869.

Les nombres d'hommes présents sont représentés par les largeurs des zones colorées à raison d'un millimètre pour dix mille hommes; ils sont de plus écrits en lettres des zones. Le rouge désigne les hommes qui ont été en Russie, le noir ceux qui en sont sortis. Les renseignements qui ont servi à dresser la carte ont été puisés dans les ouvrages de M. M. Thiers, de Ségur, de Fezensac, de Chambray et le journal inédit de Jacob, pharmacien de l'Armée depuis le 28 Octobre.

Pour mieux faire juger à l'œil la diminution de l'armée, j'ai supposé que les corps du Prince Jérôme et du Maréchal Davout qui avaient été détachés sur Minsk et Mohilow et ont rejoint vers Orscha et Witebsk, avaient toujours marché avec l'armée.

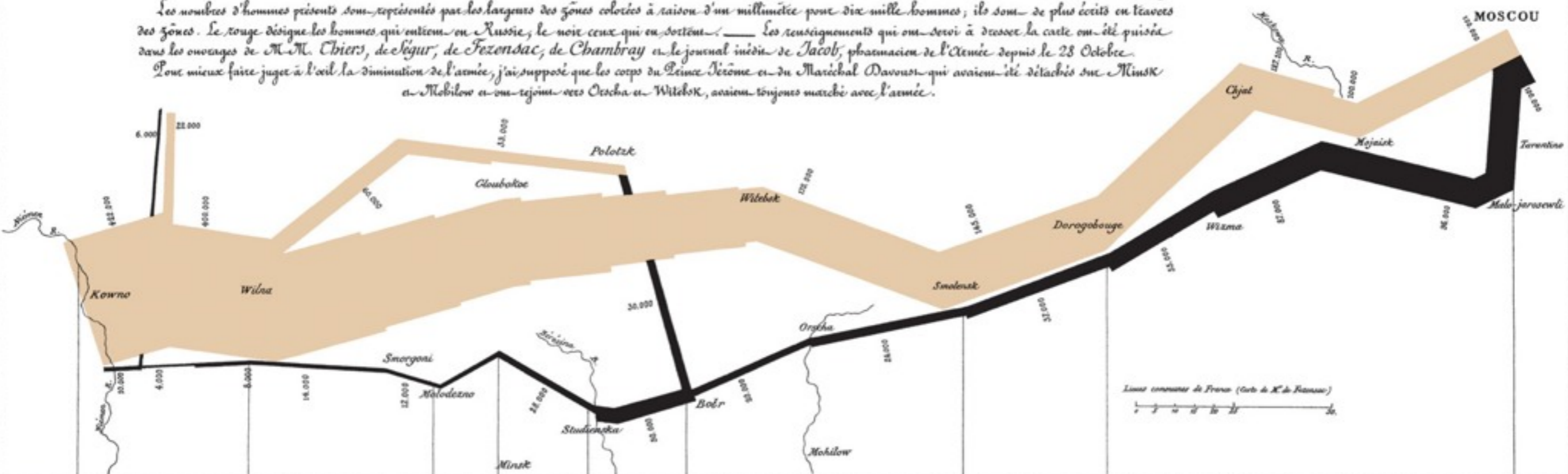
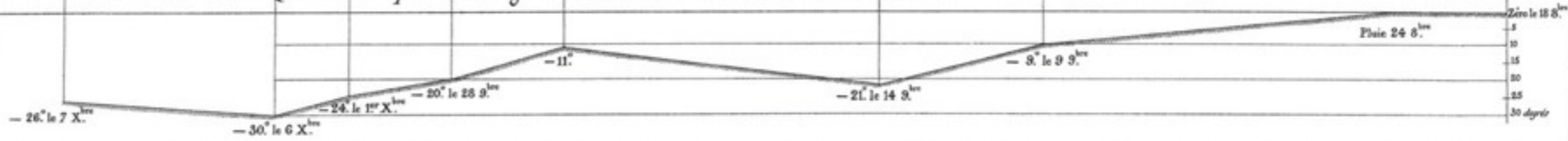


TABLEAU GRAPHIQUE de la température en degrés du thermomètre de Réaumur au dessous de zéro.



Les Cosaques passent au galop le Niémen gelé.

Antiq. par Regnier, 1. Par. 3<sup>e</sup> Mars 5<sup>e</sup> 6<sup>e</sup> à Paris.

Imp. Lit. Regnier et Dorel.

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TALKS

Hans Rosling shows the best stats you've ever seen

TED2006, Filmed Feb 2006; Posted Jun 2006



3,471,109 Views ?

Like 33k

INTERACTIVE TRANSCRIPT

ABOUT THE SPEAKER

ABOUT THIS TALK

You've never seen data presented like this. With the drama and urgency of a sportscaster, statistics guru Hans Rosling debunks myths about the so-called "developing world."



THE ROLEX ARTS INITIATIVE PAIRS ESTABLISHED MENTORS WITH EMERGING PROTÉGÉS FOR A YEAR OF CREATIVE COLLABORATION

WHAT TO WATCH NEXT



Hans Rosling's new insights on poverty

18:57 Posted: Jun 2007

Views 1,616,080 | Comments 193

Video player controls including play button, volume, progress bar (00:17 / 19:53), Share button, Rate button, and Subtitles Available in: 45 languages [Off]

# RECOMMENDED READING





# Visualization

A major application area of computer graphics is *visualization*, where computer-generated images are used to help people understand both spatial and non-spatial data. Visualization is used when the goal is to augment human capabilities in situations where the problem is not sufficiently well defined for a computer to handle algorithmically. If a totally automatic solution can completely replace human judgement, then visualization is not typically required. Visualization can be used to generate new hypotheses when exploring a completely unfamiliar dataset, to confirm existing hypotheses in a partially understood dataset, or to present in-

---

**A survey of powerful visualization techniques,  
from the obvious to the obscure.**

---

**BY JEFFREY HEER, MICHAEL BOSTOCK, AND VADIM OGIEVETSKY**

---

# A Tour Through the Visualization Zoo

THANKS TO ADVANCES in sensing, networking, and data management, our society is producing digital information at an astonishing rate. According to one estimate, in 2010 alone we will generate 1,200 exabytes—60 million times the content of the Library

# The Value of Visualization

Jarke J. van Wijk\*

Dept. Mathematics and Computer Science  
Technische Universiteit Eindhoven

## ABSTRACT

The field of Visualization is getting mature. Many problems have been solved, and new directions are sought for. In order to make good choices, an understanding of the purpose and meaning of visualization is needed. Especially, it would be nice if we could assess what a good visualization is. In this paper an attempt is made to determine the value of visualization. A technological viewpoint is adopted, where the value of visualization is measured based on effectiveness and efficiency. An economic model of visualization is presented, and benefits and costs are established. Next, consequences for and limitations of visualization are discussed (including the use of alternative methods, high initial costs, subjectiveness, and the role of interaction), as well as examples of the use of the model for the judgement of existing classes of methods and understanding why they are or are not used in practice. Furthermore, two alternative views on visualization are presented and discussed: viewing visualization as an art or as a scientific discipline. Implications and future directions are identified.

**CR Categories:** H.5.2 [Information Interfaces and Presentation]: User Interfaces; I.3.6 [Computer Graphics]: Methodology and Techniques I.3.8 [Computer Graphics]: Applications

**Keywords:** Visualization, evaluation

## 1 INTRODUCTION

Modern society is confronted with a data explosion. Acquisition devices like MRI-scanners, large scale simulations on supercomputers, but also stock trading at stock exchanges produce very large amounts of data. Visualization of data makes it possible for researchers, analysts, engineers, and the lay audience to obtain insight

In this paper I want to give a contribution to the discussion on the status and possible directions of our field. Rather than to pinpoint specific topics and activities, my aim is to detect overall patterns, and to find a way to understand and qualify visualization in general. This is an ambitious and vague plan, although the basic ground for this is highly practical.

I have to make decisions on visualization in many roles. As a researcher, decisions have to be made ranging from which area to spend time on to which particular solution to implement; as a supervisor, guidance to students must be provided; as a reviewer, new results and proposals for new research must be judged, and opinions are expected if they are worth publishing or funding; as advisor in a start-up company, novel and profitable directions must be spotted. All these cases imply judgement of the value of visualization in varying senses.

How to assess the value of visualization? Visualization itself is an ambiguous term. It can refer to the research discipline, to a technology, to a specific technique, or to the visual result. If visualization is considered as a technology, i.e., as a collection of methods, techniques, and tools developed and applied to satisfy a need, then standard measures apply: Visualization has to be *effective* and *efficient*. In other words, visualization should do what it is supposed to do, and has to do this using a minimal amount of resources. One immediate and obvious implication is that we cannot judge visualization on its own, but have to take into account the context in which it is used.

In section 2 a short overview is given of the background of the topic discussed here. In section 3 an economic model of visualization is proposed. The basic elements are identified first, the associated costs and gains are added next. Various implications of the model are discussed in section 4. In section 5 this model is applied to several cases. In section 6 the model is discussed and alternative views are considered, followed by conclusions in section 7.

-WHAT

-WHY

-WHO

-HOW

# Miriah Meyer

assistant professor

School of Computing *and* Scientific Computing and Imaging Institute  
University of Utah

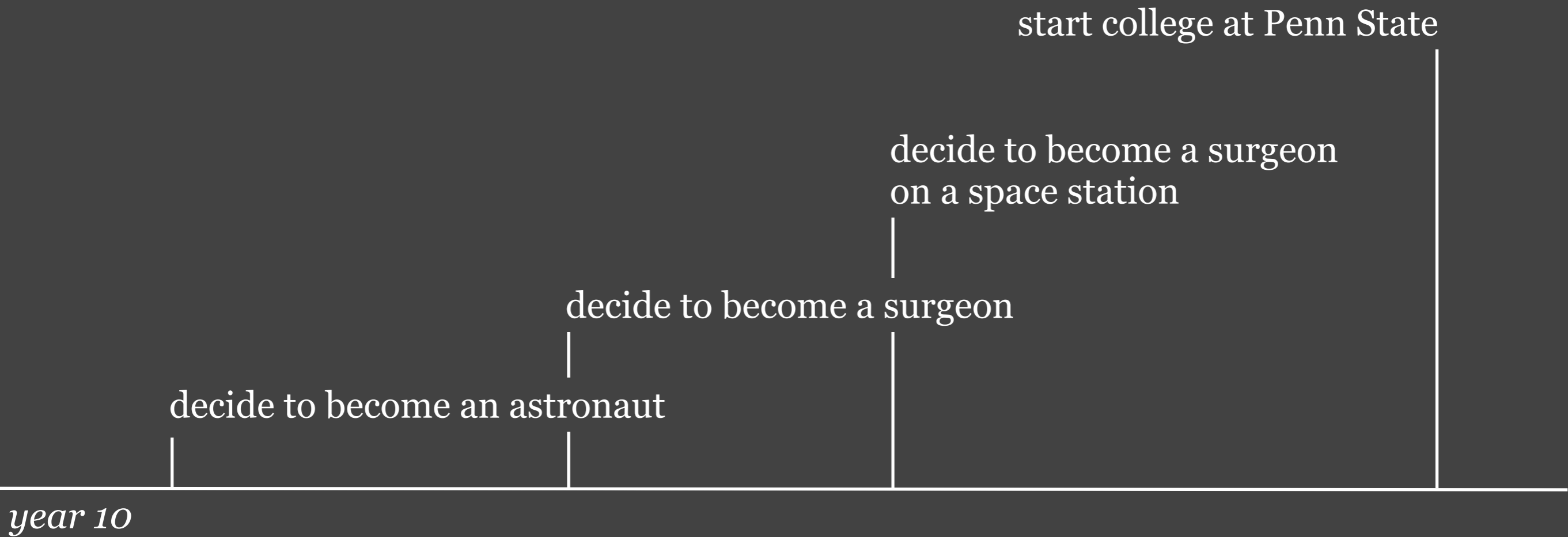
WEB 4887

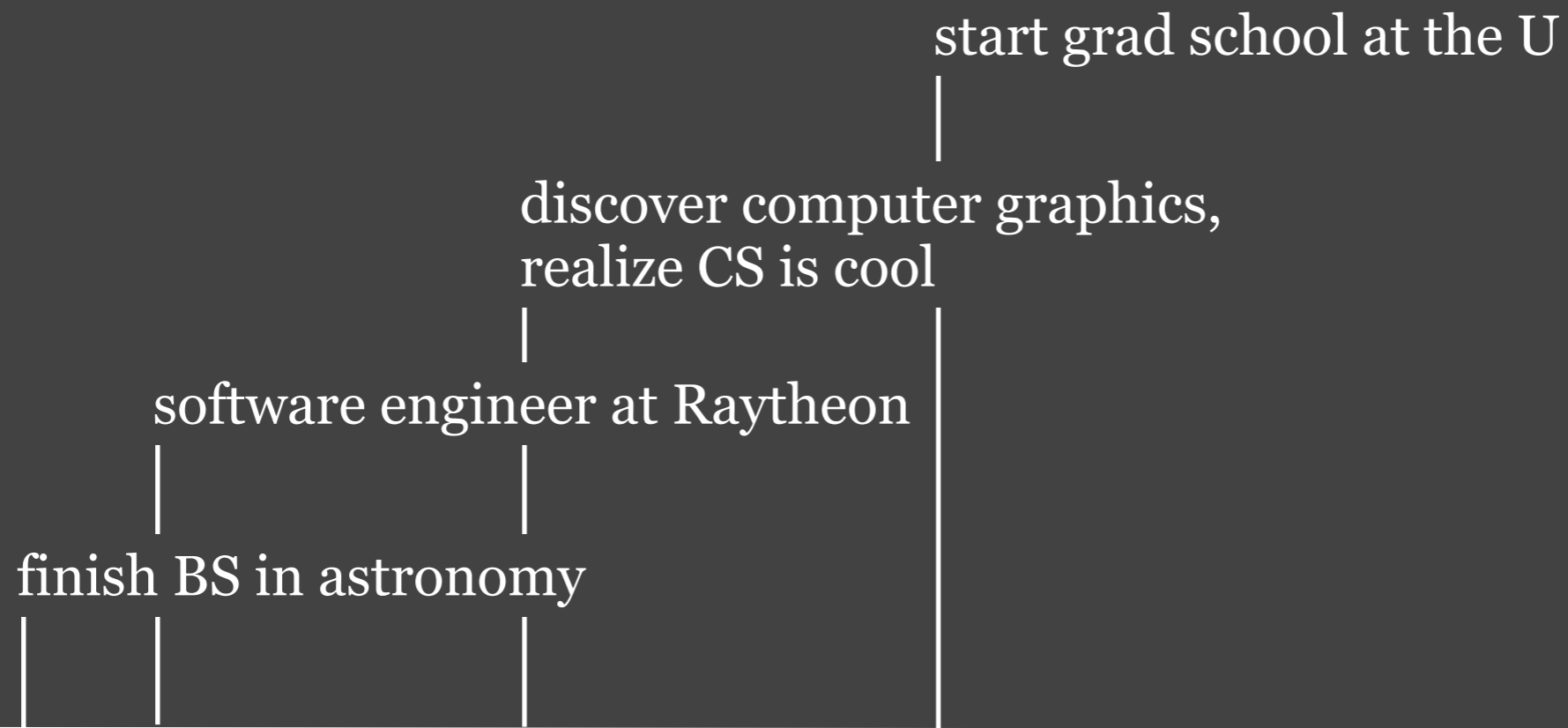
[miriah@cs.utah.edu](mailto:miriah@cs.utah.edu)

dad buys a Commodore64

born in Martinsville, VA

*year 0*





*year 20*

assistant professor at the U in  
School of Computing and SCI

postdoc at Harvard University

finish PhD in computer science

*year 30*



**YOU ARE HERE**



YOU

-WHAT

-WHY

-WHO

-HOW

The **goal of this course** is to provide a framework for discussing, critiquing, and designing information visualizations.

By the end of this course you will be able to **evaluate and design** information visualizations using appropriate **vocabulary and principles**.

# CONTENT

# PRINCIPLES

- design
- process
- data
- visual encoding
- tasks and interaction
- abstraction

# METHODS

- visual representations
- multiple views
- filtering and aggregation
- dimensionality reduction
- evaluation

# A TOUR THROUGH THE ZOO

- tabular data
- graphs and trees
- text
- maps
- toolkits

# GUEST LECTURES

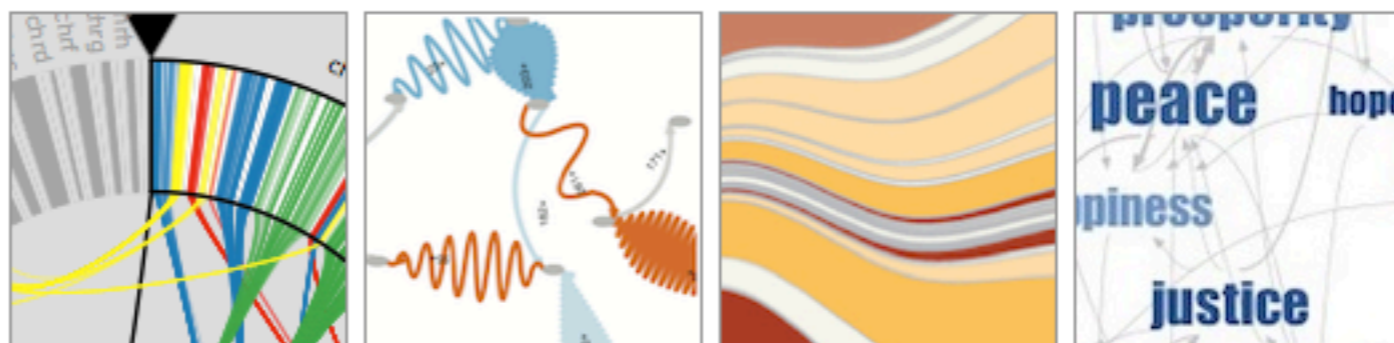
- Jim Agutter, *Considering the Human*
- student presentations



# NUTS & BOLTS

# CS6964 | Information Visualization | Spring 2012

**INSTRUCTOR:** Miriah Meyer  
**TIME:** T/Th 2-3:20pm  
**PLACE:** 1450 WEB  
**OFFICE HRS:** T 3:30-5:30pm,  
 4887 WEB



[SCHEDULE](#) | [SYLLABUS](#) | [LECTURES](#) | [PROJECTS](#) | [PRESENTATIONS](#) | [PARTICIPATION](#) | [RESOURCES](#)

The goal of this course is to develop a vocabulary and framework for discussing, critiquing, and designing information visualization tools. The course syllabus and schedule are still tentative and subject to change.

## SCHEDULE

WEEK	DATE	TOPIC	DATE	TOPIC
1	1/10	Introduction	1/12	Design
2	1/17	Process	1/19	Data
3	1/24	Visual encoding	1/26	Tasks and interaction
4	1/31	Data and task abstraction 1	2/2	<i>no class</i>
5	2/7	Visual representations	2/9	Multiple views
6	2/14	Filtering and aggregation	2/16	Dimensionality reduction
7	2/21	Data and task abstraction 2	2/23	Tabular data
8	2/28	Graphs and trees	3/1	Text
9	3/6	Maps	3/8	Toolkits
10	3/12	<i>no class</i>	3/14	<i>no class</i>
11	3/20	Design studies	3/22	Considering the human
12	3/27	Project updates 1	3/29	Project updates 2
13	4/3	Project updates 3	4/5	Student presentations, tbd
14	4/10	Student presentations, tbd	4/12	Student presentations, tbd
15	4/17	Student presentations, tbd	4/19	Evaluation

L2: Design

# REQUIRED READING

POINTS OF VIEW

# Color coding

Color can add dimensionality and richness to scientific communications. In figures, color is typically used to differentiate

inform  
discrim

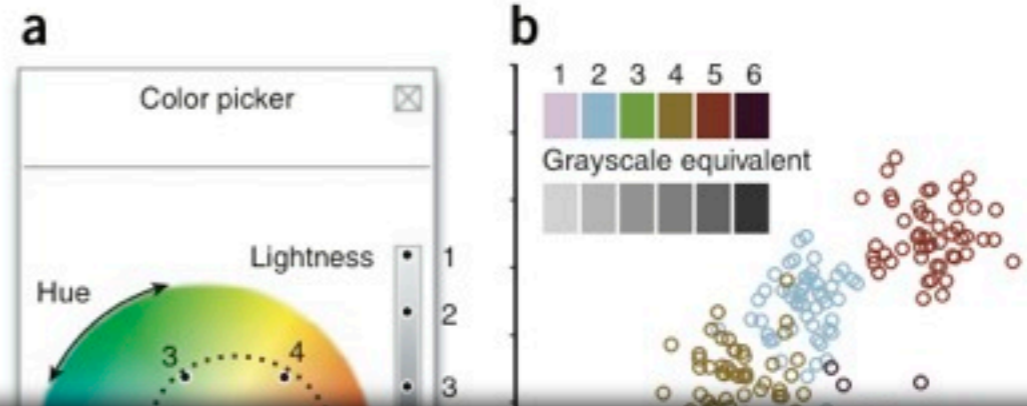
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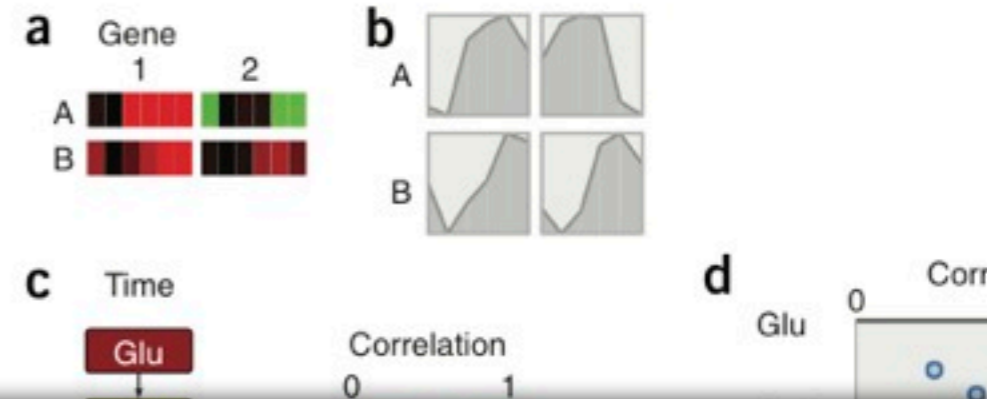
POINTS OF VIEW

# Avoiding color

Last month I wrote about color blindness and ways to make information accessible to individuals with color vision deficiencies. I

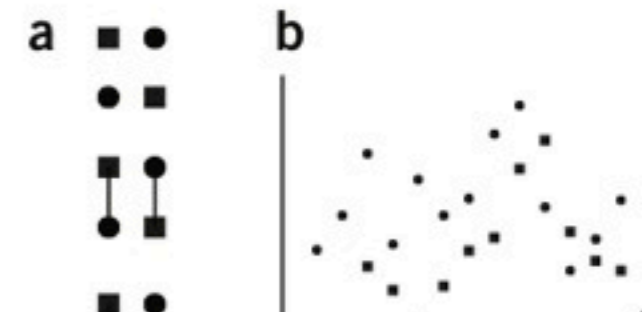
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POINTS OF VIEW

# Gestalt principles (Part 1)



### *The Decision to Launch the Space Shuttle Challenger*

ON January 28, 1986, the space shuttle Challenger exploded and seven astronauts died because two rubber O-rings leaked.<sup>22</sup> These rings had lost their resiliency because the shuttle was launched on a very cold day. Ambient temperatures were in the low 30s and the O-rings themselves were much colder, less than 20°F.

One day before the flight, the predicted temperature for the launch was 26° to 29°. Concerned that the rings would not seal at such a cold temperature, the engineers who designed the rocket opposed launching Challenger the next day. Their misgivings derived from several sources: a history of O-ring damage during previous cool-weather launches of the shuttle, the physics of resiliency (which declines exponentially with cooling), and experimental data.<sup>23</sup> Presented in 13 charts, this evidence was faxed to NASA, the government agency responsible for the flight. A high-level NASA official responded that he was “appalled” by the recommendation not to launch and indicated that the rocket-maker, Morton Thiokol, should reconsider, even though this was Thiokol’s only no-launch recommendation in 12 years.<sup>24</sup> Other NASA officials pointed out serious weaknesses in the charts. Reassessing the situation after these skeptical responses, the Thiokol managers changed their minds and decided that they now favored launching the next day. They said the evidence presented by the engineers was inconclusive, that cool temperatures were not linked to O-ring problems.<sup>25</sup>

Thus the *exact cause* of the accident was intensely debated during the evening before the launch. That is, for hours, the rocket engineers and managers considered the question: *Will the rubber O-rings fail catastrophically tomorrow because of the cold weather?* These discussions

<sup>22</sup> My sources are the five-volume *Report of the Presidential Commission on the Space Shuttle Challenger Accident* (Washington, DC, 1986) hereafter cited as *PCSSCA*; Committee on Science and Technology, House of Representatives, *Investigation of the Challenger Accident* (Washington, DC, 1986); Richard P. Feynman, “*What Do You Care What Other People Think?*” *Further Adventures of a Curious Character* (New York, 1988); Richard S. Lewis, *Challenger: The Final Voyage* (New York, 1988); Frederick Lighthall, “*Launching the Space Shuttle Challenger: Disciplinary Deficiencies in the Analysis of Engineering Data*,” *IEEE Transactions on Engineering Management*, 38 (February 1991), pp. 63–74; and Diane Vaughan, *The Challenger Launch Decision: Risky Technology, Culture, and Deviance at NASA* (Chicago, 1996). The text accompanying the images at left is based on *PCSSCA*, volume 1, pp. 6–9, 19–32, 52, 60. Illustrations of shuttle at upper left by Weilin Wu and Edward Tufte.

<sup>23</sup> *PCSSCA*, volume 1, pp. 82–113.

<sup>24</sup> *PCSSCA*, volume 1, p. 107.

<sup>25</sup> *PCSSCA*, volume 1, p. 108.