

## Things They Don't Teach You in Graduate School

Ces choses qu'on ne vous enseigne pas aux études supérieures

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Sixième congrès canadien des étudiants en statistique  
Université McGill | McGill University  
Montréal, Québec

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# Already | Déjà

Things They Don't Teach You in Graduate School<sup>1</sup>

James A Hanley

McGill University

## Abstract

Much of what statisticians teach and use in practice is learnt 'on the job.' I recount here some of my early statistical experiences, and the lessons we might learn from them. They are aimed at those of you starting out in the profession today, and at the teachers who train you. I stress the importance of communication.

## Key Words

communication; communication; communication.

Fred Mosteller, Mentor '77-'80



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<sup>1</sup>An expansion on some after-dinner remarks made at the Conference of Applied Statisticians of Ireland, held in Killarney, May 17-19, 2006. The article is dedicated to two former colleagues – and superb communicators – [Fred Mosteller](#) and [Steve Lagakos](#), who are no longer with us.

Steve Lagakos, Colleague '73-'80



# Lake | lac Ontario entre 1975 et 1977

<http://www.biostat.mcgill.ca/hanley/SailingLakeOntario.mov>

Lagakos, interviewed by a biostatistics student as part of a Harvard course

<http://www.biostat.mcgill.ca/hanley/Lagakos/leadershipInterviewTamarSofer.pdf>

<http://www.biostat.mcgill.ca/hanley/Lagakos/SteveLagakosInterview.WAV>

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James A. Hanley, Ph.D.  
Barbara J. McNeil, M.D., Ph.D.



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## **The Meaning and Use of the Area under a Receiver Operating Characteristic (ROC) Curve<sup>1</sup>**

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## HSPH's Marvin Zelen dies at 87

Was considered a 'tremendous force' in biostatistics

November 19, 2014 | Editor's Pick



Photo by Shaina Andelman

Harvard Professor Marvin Zelen was noted for developing the statistical methods and study designs that are used in clinical cancer trials, in which experimental drugs are tested for toxicity, effectiveness, and proper dosage.

HSPH Communications

Professor Marvin Zelen of the Department of Biostatistics at the Harvard T.H. Chan School of Public Health

## Topics in that piece | Les sujets dans cette partie

- Statistical Lineage, and Statistical History
- Green
- Jokes, and Other Teaching Tools
- 1st On-The-Job Lesson: Exact vs. Approx.
- **Communication**
- Errors of Type III and Beyond
- **Communication, Part II**
- Not in the Clinical Trials Textbooks
- **The Ten-Minute Consultation**
- Not the Usual Delta
- The Bigger Picture, and Other **Media**
- Sharing our statistical methods
- Tell Them What You Said

## Outline

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- Selected items from that piece
- STATISTICAL LEARNING
- STATISTICAL PRACTICE

## Plan

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- Sujets choisis de cette partie
- L'APPRENTISSAGE DE LA STATISTIQUE
- LA PRATIQUE DE LA STATISTIQUE

Classroom and Platform Performance  
Frederick Mosteller  
*The American Statistician*  
Vol. 34, No. 1 (Feb., 1980), pp. 11-17

- <http://www.biostat.mcgill.ca/hanley/communicationCommunicationCommunication/MostellerClassoomPlatform.pdf>
- <https://www.umass.edu/wsp/resources/tales/mosteller.html>
- <https://www.tandfonline.com/doi/abs/10.1080/00031305.1962.10479594>
- <https://goo.gl/images/Ee4NCF>



# Mentor | Mentor



**Maurice McGregor, MD**

<https://muhc.ca/newsroom/article/dr-maurice-mcgregor-faculté-médecine-1?université-président-1?unité-dévaluation-technologie>

<http://www.cardiomuhc.ca/maurice-mcgregor>

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# How long did their hearts go on? A *Titanic* study

James A Hanley, Elizabeth Turner, Carine Bellera, Dana Teltsch

Several studies have examined post-traumatic stress in people who survive disasters but few have looked at longevity. The 1997 film *Titanic* followed one character, apparently fictional, but the longevity of the actual survivors, as a group, has not been studied. Did the survivors of the sinking of the *Titanic* have shortened life spans? Or did they outlive those for whom 14-15 April 1912 was a less personal night to remember?

## Subjects, methods, and results

We limited our study to passengers. We used data from biographies listed in Encyclopedia Titanica, a website that claims to have “among the most accurate passenger and crew lists ever compiled.”<sup>1</sup> Of the 500 passengers listed as survivors, 435 have been traced. We calculated the proportion alive at each anniversary of the sinking.

# Hazardous journeys

Department of  
Epidemiology,  
Biostatistics, and  
Occupational  
Health, McGill  
University, 1020  
Pine Avenue West,  
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Canada H3A 1A2

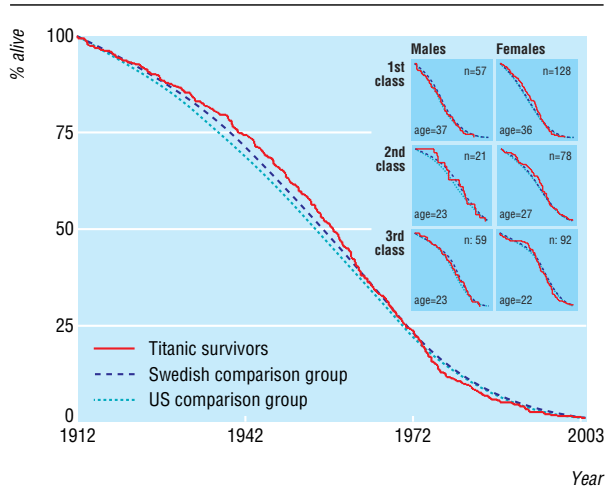
James A Hanley  
*professor*

Carine Bellera  
*graduate student*

Dana Teltsch  
*graduate student*

Department of  
Mathematics and  
Statistics, McGill  
University

Elizabeth Turner  
*graduate student*



Percentage still alive on each anniversary of sinking of *Titanic* among 435 survivors and Swedish and white American comparison groups matched for age and sex. Inset: analysis by sex and class of travel (n=No of passengers; age=median age in 1912)

## media

[http://www.biostat.mcgill.ca/hanley/bios602/  
b-d-II-ch-1-2-3/InterviewGlobalTV.mov](http://www.biostat.mcgill.ca/hanley/bios602/b-d-II-ch-1-2-3/InterviewGlobalTV.mov)

[http://www.biostat.mcgill.ca/hanley/bios602/  
b-d-II-ch-1-2-3/radioCanadaInternational.mp3](http://www.biostat.mcgill.ca/hanley/bios602/b-d-II-ch-1-2-3/radioCanadaInternational.mp3)

# Hazardous journeys

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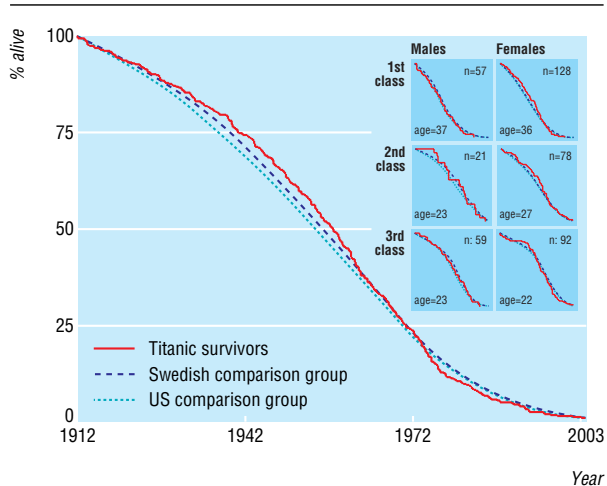
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Elizabeth Turner  
*graduate student*



Percentage still alive on each anniversary of sinking of *Titanic* among 435 survivors and Swedish and white American comparison groups matched for age and sex. Inset: analysis by sex and class of travel (n=No of passengers; age=median age in 1912)

# The Gazette

MONTREAL SATURDAY, DECEMBER 20, 2003 QUEBEC'S OLDEST DAILY SINCE 1778 FIRST EDITION



The world was introduced to the Freedom Tower yesterday, but the "world's highest" building, to replace the World Trade Centre buildings, is actually 12 metres shorter than Toronto's CN Tower. **Page A25**

## RETURN OF THE SUPERMAYOR



## INDEX

Annie's Mailbox	F7	Legals/Auctions	F5
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Carl Napoleon, manager of the Rogers cell-phone shop across the street.

Please see **SNOW**, Page A4

## Titanic survivors led long lives

### Trauma didn't affect lifespan, study finds

AARON DERFEL  
GAZETTE HEALTH REPORTER

Yes, their hearts did go on.

McGill University researchers have discovered that most survivors of the sinking of the Titanic ended up living long, full lives after the 1912 tragedy.

In fact, most slightly outlived average Americans of their time who were never involved in a disaster.

The findings - published in yesterday's *British Medical Journal* - contradict assumptions that post-traumatic stress disorder might have cut short their lives.

Please see **TITANIC**, Page A4

On Ste. Catherine St. near Peel St. yesterday: The one million people who pass through the city's centre are slipping, sliding and almost double-lutting their way to the office or Christmas shopping.

RICHARD ARLESS JR., THE GAZETTE

## Cintec's latest controversy

### Waste-management firm blames probes of Salvadoran landfill on bare-knuckles politics

DON MACDONALD  
THE GAZETTE

Money laundering, drug trafficking, municipal corruption: the allegations and innuendo hang-

ing over Montreal waste-management company Cintec Group could hardly be more serious.

Cintec operates the largest landfill in the tiny Central American country of El Salvador. For

a year, the company and the landfill project have been bombarded by dozens of damaging headlines in Salvadoran newspapers and been made the subject of no fewer than three official investigations.

Please see **GARBAGE**, Page A2  
**Paper tried to dig up dirt**, Page A3

## QUOTE

Terrible is the temptation to be good.  
Bertolt Brecht

## WEATHER

Sunny breaks  
High -7° Low -13° Page C7

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St. Not hit the ways of what's it's been past cut How know w or, mor days, a bles a P nibblu he's g one th throw are sh double-offic would the bul

Pla

...epine: too many  
That's up by 1.1 per  
ts.  
tians continue to  
feel that there are  
immigrants coming  
1 per cent, up from  
n a June survey.)"

immigration system" plank in  
the recent election.  
The Conservative platform  
promised to bring "good people  
into Ontario while keeping bad  
people out." The document also  
slammed the federal govern-  
ment, which has jurisdiction

saving about the right number of  
immigrants were entering the  
country.  
Residents of British Columbia  
and the territories were most in-  
clined to see immigration levels  
as being about right (46 per cent,  
down from 50 per cent). That

ly than men — 42 versus 34 per  
cent, respectively — to feel that  
"too many" immigrants come to  
Canada, particularly those over  
35 years of age.  
Also consistent with previous  
findings is that Canadians with a  
higher level of education are less

amount fell to 38 per cent from 47  
per cent.  
The national poll of 1,675  
Canadians was conducted Sept.  
2-7 by Pollara and is considered  
accurate within 2.4 percentage  
points, 19 times out of 20.  
OTTAWA CITIZEN

## Mayor speed aval

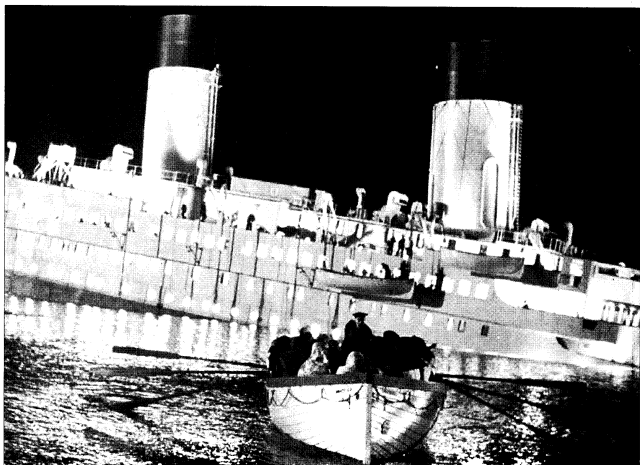
tions make it hard-  
kers.  
r to do our job on  
ave been cleared."  
tients cancelled ap-  
his week at a radiol-  
the Seaforth build-  
es Neiges Rd.  
older folk looked  
low, saw the snow  
they didn't want to  
Mary Gibson, a re-  
Seaforth Radiology

ndoor parking off  
s, she said, but the  
low priority for bor-  
rows.  
it worse," Gibson

really bad, it's hard  
people deal with it—  
sigh and wait for it  
r."

carroll@  
le.canwest.com

## ices ashed



A scene from the 1998 movie Titanic. Taking a cue from the blockbuster, researchers studied the longevity of first-, second- and third-class passengers, and their findings fly in the face of conventional wisdom that the privileged lead longer lives.

COURTESY OF 20TH CENTURY FOX

rupted

in-more snow wallop disrupted adapted- and some regular Montreal Island. sential services for sengers were can- week because of the d road conditions, aradis, a Montreal p spokesperson. rities were getting ical appointments, " she said - meaning transit services for leisure trips. helered workshops tectually handi- nce cancelled, she access roads had not 1, and the people are n on their feet." panies, which norle 60 per cent of sit, couldn't keep up dverse driving con- ncreased customer radis said. as routes also experi- and disruptions. d 211 buses on Lake- 1 Beaconsfield were of St. Charles Blvd., 1. "There was no salt was a skating rink." ighter side, the sub- way was busier than usu- ne of year, she said. t snow in the metro, e fewer delays."

# Titanic | 'This was a survival of the fittest'

CONTINUED FROM A1

Taking a cue from Titanic, the 1997 movie blockbuster starring Leonardo DiCaprio and Kate Winslet, researchers also examined the longevity of first-, second- and third-class passengers. Again, the findings fly in the face of conventional wisdom that the privileged lead longer lives.

Whether a Titanic passenger sailed steerage - like Jack Dawson, the fictional film character portrayed by DiCaprio - or sipped champagne - like Winslet's young socialite, Rose De Witt Bukater - survivors in all classes ended up living just as long.

James Hanley, a statistician in McGill's department of epidemiology and biostatistics, said the lives of Titanic survivors have been investigated so thoroughly, they are ideal candidates for a longevity study.

"Did the experience they have - would it mean they're so hardened and so lucky and so thankful that they're going to live forever, like the song says?" Hanley asked.

He was referring to the film's treacly power ballad, My Heart Will Go On, performed by Quebec's chest-thumping chanteuse, Céline Dion.

"Or," Hanley continued, "were they so traumatized and the men so guilt-ridden" they would die

prematurely?

To answer those questions, he and three graduate students pored through a trove of biographical data in the Encyclopedia Titanica, a Web site claiming to have "among the most accurate passenger and crew lists ever compiled" of the voyage.

The researchers compared the longevity of 435 of the 500 survivors with control groups in the United States and Sweden.

The study showed that, on average, a Titanic survivor lived 1.7 years longer than someone in the general population in the United States at the time of the sinking and half a year longer than a member of a similar group in Sweden.

More than half of the survivors lived well into their 70s - roughly equal to the longevity of the comparison groups.

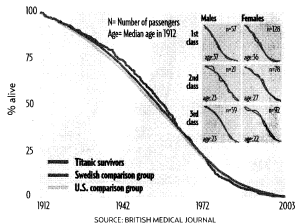
Five people lived past 100, and the three remaining survivors are now in their 90s. They're all female - to be expected, given that women have a higher life expectancy than men. Two sailed in third class, one in second.

Hanley, who sailed on the Queen Elizabeth II from New York to London in 1969, said the results suggest the tragedy was consistent with the Darwinian theory of survival of the fittest.

"These are lucky people who

## TITANIC SURVIVORS DIE AT NORMAL RATE

Percentage still alive on each anniversary of the sinking of the Titanic among 435 survivors, and Swedish and white American comparison groups matched for age and sex.



THE GAZETTE

were going to live a long time, who were going to value their lives and were going to be doubly careful," he explained.

"Some people have said this was a survival of the fittest, and that, of course, the survivors were going to do well."

The study also turned on its head the notion that the affluent - who can afford the best health care and who eat better than the underprivileged - live longer.

"We immediately thought the survivors of first and second class would do very well because they are so privileged," Hanley said. "The upshot is that this first-class team wasn't very first class."

The study was published in the journal's end-of-the-year edition, reserved for upbeat research papers.

aderfel@  
thegazette.canwest.com

# It doesn't seem to be any pattern, any plan,' cop says

lectress Parker de- ture time, since a de- ing bond, was re- plicable to all but

pattern, any plan. You'll walk about, see black and blue, get to the hospital and if there's no one had to be tested

In reaction to the city's apparent lethargy, local merchants have started to mention own personnel to at least clear the patch

route an ambulance down Ste. Catherine St. "Emergency vehicles might have had a difficult time of it this

combination of heavy snowfall, freezing rain and sudden freezes since Monday. But for people like Parker, who



ACTUALITÉS

## Les survivants du *Titanic* s'en sont bien sortis

MATHIEU PERREAULT

Quand il a vu le film *Titanic*, avec Leonardo di Caprio et Kate Winslet, James Hanley s'est demandé de quelle manière la catastrophe avait marqué les survivants du naufrage. Son réflexe est bien normal : M. Hanley est professeur d'épidémiologie à l'Université McGill.

Quelques années plus tard, il a trouvé le moyen d'élucider la question. Il a trouvé, sur Internet, une liste de biographies de la presque totalité des passagers du *Titanic*. Il a ensuite posé une question à ses étudiants : en raison du traumatisme du naufrage, les survivants du *Titanic* ont-ils vécu moins longtemps que la population moyenne ?

La réponse a surpris M. Hanley : la catastrophe ne semble pas avoir affecté la longévité des passagers. « On pourrait s'attendre à ce que la mort de membres de la famille, l'attente dans l'eau glacée, ou le sentiment de culpabilité à l'idée d'avoir eu la chance d'échapper au sort horrible des noyés, affecte la vie, et donc la longévité, des survivants. Mais nos calculs montrent que non. Ça amène de l'eau au moulin des gens qui disent que le concept de stress post-traumatique n'entraîne pas de conséquences à long terme. »

### Recherches plus légères...

L'épidémiologiste et ses étudiants publient leur étude dans le dernier numéro du *British Medical Journal*, une prestigieuse revue médicale qui consacre ses numéros de Noël à des recherches plus légères. Le numéro de cette année comporte notamment une étude des panneaux

rouliers indiquant les zones où venaient de nombreuses personnes âgées.

L'analyse des données du site Encyclopedia Titanica n'est pas terminée. « Je veux vérifier si la longévité est la même pour les survivants ayant perdu des membres de leur famille, et si le survivant était enfant ou adulte en 1912 », dit M. Hanley, qui a un grand intérêt pour l'océan et les paquebots depuis son enfance sur une île irlandaise. Une analyse de la classe sociale des survivants laisse déjà entrevoir que plus le survivant est riche, plus il est affecté par le traumatisme ; les survivants de première classe ont la même longévité que ceux de troisième, alors qu'on pourrait s'attendre à ce que les riches de cette époque vivent plus longtemps que les pauvres.

L'étude de l'impact de certains événements sur la longévité est un champ de l'épidémiologie qui gagne en importance. « Il y a notamment un épidémiologiste torontois, Don Redelmeier, qui a étudié l'impact de gagner un Oscar et celui d'être le président d'une classe de médecine, dit M. Hanley. Les gagnants des Oscars vivent quatre ans plus vieux que ceux qui n'avaient eu qu'une nomination ; dans le deuxième cas, la charge de président a un effet négatif, elle enlève deux ans à l'espérance de vie. »

Ce domaine pointu n'est pas exempt de controverses. « Redelmeier a dit à Discovery Channel que mon étude n'est pas valable parce que mon analyse exclut 17 % des survivants, pour lesquels on n'a pas de données, indique M. Hanley. Je suis d'accord qu'il faut affiner les analyses, mais je pense que notre article est pertinent. »

# STATISTICAL LEARNING | L'APPRENTISSAGE DE LA STATISTIQUE

## STATISTICAL LEARNING

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- Minimalist
- Real-life props
- Simulations/Animations
- Unity/Logic
- Curiosity

## L'APPRENTISSAGE DE LA STATISTIQUE

---

- Minimaliste
- Accessoires dans la vraie vie
- Simulations/Animations
- Unité/Logique
- Curiosité

## Minimalist... examples

- $E\left[\frac{\sum(y-\bar{y})^2}{n}\right] = \frac{n-1}{n}\sigma^2$

$n = 2; y \in (0,1)$  or  $(1,2,3)$

[http://www.biostat.mcgill.ca/hanley/c607/ch01/mm\\_ch\\_01.pdf](http://www.biostat.mcgill.ca/hanley/c607/ch01/mm_ch_01.pdf) page 4

- Structure of  $\hat{\beta}$  &  $\text{Var}[\hat{\beta}]$  when fitting  $E[Y|X] = \beta X$  using various criteria

Fit Model with 1 para to dataset with  $n = \underline{2}$

y	x
2	1
8	2

<http://www.biostat.mcgill.ca/hanley/2DatapointsAndaModel/>

- GEE: heights(y) of  $n = 3$  children in 2 families

[http://www.biostat.mcgill.ca/hanley/Reprints/aje\\_gee\\_orientation.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/aje_gee_orientation.pdf)

## Minimaliste... exemples

- $E\left[\frac{\sum(y-\bar{y})^2}{n}\right] = \frac{n-1}{n}\sigma^2$

$n = 2; y \in (0,1)$  où  $(1,2,3)$

[http://www.biostat.mcgill.ca/hanley/c607/ch01/mm\\_ch\\_01.pdf](http://www.biostat.mcgill.ca/hanley/c607/ch01/mm_ch_01.pdf) page 4

- Structure de  $\hat{\beta}$  &  $\text{Var}[\hat{\beta}]$  lors de l'ajustement de  $E[Y|X] = \beta X$  en utilisant divers critères

Ajuster Modèle avec 1 para au jeu de données avec  $n = \underline{2}$

y	x
2	1
8	2

<http://www.biostat.mcgill.ca/hanley/2DatapointsAndaModel/>

- GEE: Taille(y) de  $n = 3$  enfants de 2 familles

[http://www.biostat.mcgill.ca/hanley/Reprints/aje\\_gee\\_orientation.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/aje_gee_orientation.pdf)

## Real-life props / Visualizations

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- Elevators  
(  $L_1$  vs.  $L_2$  norm, CLT )  
<http://www.medicine.mcgill.ca/epidemiology/hanley/elevator.html>
- Travel times/distances  
(CLT, Gamma  $\leftrightarrow$  Poisson)  
[http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/clt\\_in\\_action\\_1.gif](http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/clt_in_action_1.gif)  
<http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/EnoughTires.html>
- Ages/recency of books  
MPG  $\leftrightarrow$  litres/100Km  
 $^{\circ}\text{F} \leftrightarrow ^{\circ}\text{C}$   
( Change of Scale, Jacobians )  
[http://www.biostat.mcgill.ca/hanley/Reprints/jh\\_dt\\_tas\\_2006.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/jh_dt_tas_2006.pdf)

## Accessoires dans la vraie vie / Visualisations

---

- Ascenseurs  
( norme  $L_1$  vs.  $L_2$ , TCL )  
<http://www.medicine.mcgill.ca/epidemiology/hanley/elevator.html>
- Temps de déplacements/distances  
(TCL, Gamma  $\leftrightarrow$  Poisson)  
[http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/clt\\_in\\_action\\_1.gif](http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/clt_in_action_1.gif)  
<http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/EnoughTires.html>
- Âges/récence des livres  
MPG  $\leftrightarrow$  litres/100Km  
 $^{\circ}\text{F} \leftrightarrow ^{\circ}\text{C}$   
( Changement d'échelle, Jacobiens )  
[http://www.biostat.mcgill.ca/hanley/Reprints/jh\\_dt\\_tas\\_2006.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/jh_dt_tas_2006.pdf)

## Real-life props / Visualizations

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- Words in Text  
(Length-bias)

<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/newsweek.pdf>

- % and depth of ocean  
(CLT,  $CDF^{-1}$  sampling)

<http://www.biostat.mcgill.ca/hanley/Reprints/HowDeepIsTheOcean.pdf>

<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/Oceanography/>

- Lotteries  
(E, V, multiplicity, .... )

[http://www.biostat.mcgill.ca/hanley/Reprints/jumping\\_to\\_coincidences.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/jumping_to_coincidences.pdf)

- $N(\cdot, \cdot)$ :  $s^2 \sim \text{Gamma}$  (Fisher)

<http://www.biostat.mcgill.ca/hanley/Student/HanleyEtAlStudent-FishersDerivation.pdf>

## Accessoires dans la vraie vie / Visualisations

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- Mots en Texte  
(Biais de longueur)

<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/newsweek.pdf>

- % et profondeur de l'océan  
(TCL, échantillonnage  $FR^{-1}$ )

<http://www.biostat.mcgill.ca/hanley/Reprints/HowDeepIsTheOcean.pdf>

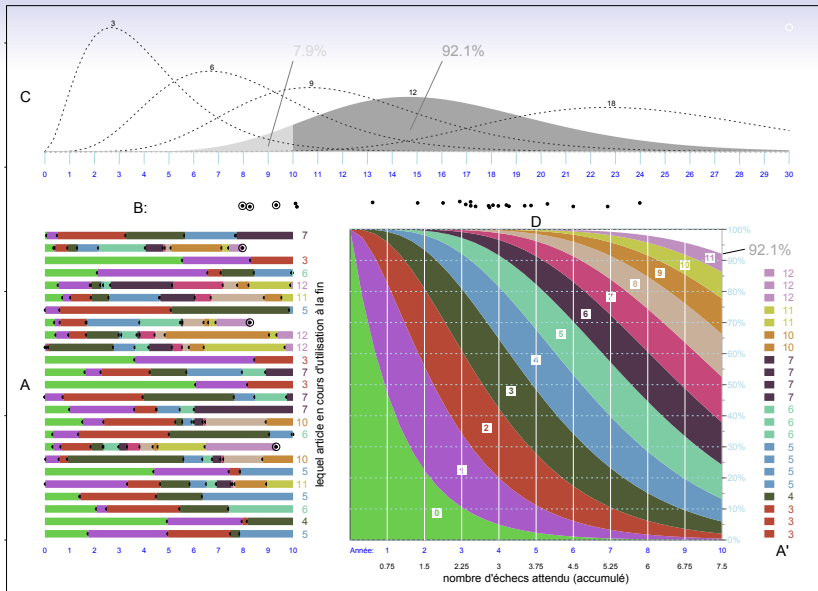
<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/Oceanography/>

- Loteries  
(E, V, multiplicité, .... )

[http://www.biostat.mcgill.ca/hanley/Reprints/jumping\\_to\\_coincidences.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/jumping_to_coincidences.pdf)

- $N(\cdot, \cdot)$ :  $s^2 \sim \text{Gamma}$  (Fisher)

<http://www.biostat.mcgill.ca/hanley/Student/HanleyEtAlStudent-FishersDerivation.pdf>



<http://www.biostat.mcgill.ca/hanley/Reprints/Accromath-2015-1-4.pdf>

<http://www.biostat.mcgill.ca/hanley/bios601/Mean-Quantile/forAccromathBackTranslate.pdf>

## Simulations/Animations

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- **Cell Occupancy**  
<http://www.biostat.mcgill.ca/hanley/bios601/Intensity-Rate/> Randomly selected visits to 1000 cells
- **Epidemics, Cards, Gambling, Lotteries**  
<http://www.biostat.mcgill.ca/hanley/c323/>
- **Chevalier de Méré**  
<http://www.biostat.mcgill.ca/hanley/bios601/Proportion/ChevalierDeMere.R.txt>
- **Bridge of Life**  
<http://www.biostat.mcgill.ca/hanley/BridgeOfLife/>
- **Cancer Screening**  
<http://www.biostat.mcgill.ca/hanley/screening/> bottom of page

## Simulations/Animations

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- **Occupation des cellules**  
<http://www.biostat.mcgill.ca/hanley/bios601/Intensity-Rate/> Visites choisies au hasard à 1000 cellules
- **Épidémies, cartes, paris, loteries**  
<http://www.biostat.mcgill.ca/hanley/c323/>
- **Chevalier de Méré**  
<http://www.biostat.mcgill.ca/hanley/bios601/Proportion/ChevalierDeMere.R.txt>
- **Le pont de la vie**  
<http://www.biostat.mcgill.ca/hanley/BridgeOfLife/>
- **Dépistage du cancer**  
<http://www.biostat.mcgill.ca/hanley/screening/> au bas de la page



## Unity/Logic

- $\widehat{\text{Var}}[\hat{\mu}] = \frac{s^2}{n}$  ;  $\widehat{\text{Var}}[p] = \frac{p(1-p)}{n}$

- Sample size power considerations

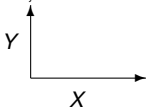
http:

[//www.biostat.mcgill.ca/hanley/Reprints/UniversalSampleSize.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/UniversalSampleSize.pdf)

- Mother of all regressions

$$g(E[y]) \sim 1$$

- Survival analysis  $\neq$  special topic (esp. if one uses ML to fit models)
- Info. ( $I$ ) rather than  $\text{Var} = I^{-1}$
- X is not a r.v. ; Y is.



## Unité/Logique

- $\widehat{\text{Var}}[\hat{\mu}] = \frac{s^2}{n}$  ;  $\widehat{\text{Var}}[p] = \frac{p(1-p)}{n}$

- Considérations pour la taille d'échantillon/puissance

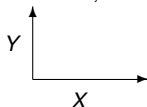
http:

[//www.biostat.mcgill.ca/hanley/Reprints/UniversalSampleSize.pdf](http://www.biostat.mcgill.ca/hanley/Reprints/UniversalSampleSize.pdf)

- Mère de toutes les régressions

$$g(E[y]) \sim 1$$

- Analyse de survie  $\neq$  sujet spécial (spéc. si on utilise MV pour ajuster modèles)
- Info. ( $I$ ) au lieu de  $\text{Var} = I^{-1}$
- X n'est pas une v.a. ; Y l'est.



## Curiosity

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- Measurement Errors:

$$F = 32 + \frac{9}{5}C$$

<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/ErrorsInXAnimation.R.txt>

- 1.08 × Woman (Galton)

<http://www.biostat.mcgill.ca/hanley/galton/>

- History

<http://www.biostat.mcgill.ca/hanley/>  
<http://www.biostat.mcgill.ca/hanley/anniversaries/>

## Curiosité

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- Erreurs de mesure:

$$F = 32 + \frac{9}{5}C$$

<http://www.biostat.mcgill.ca/hanley/bios601/Surveys/ErrorsInXAnimation.R.txt>

- 1.08 × Femme (Galton)

<http://www.biostat.mcgill.ca/hanley/galton/>

- Histoire

<http://www.biostat.mcgill.ca/hanley/>  
<http://www.biostat.mcgill.ca/hanley/anniversaries/>

# RATE OF REGRESSION IN HEREDITARY STATURE.

Fig. (a)

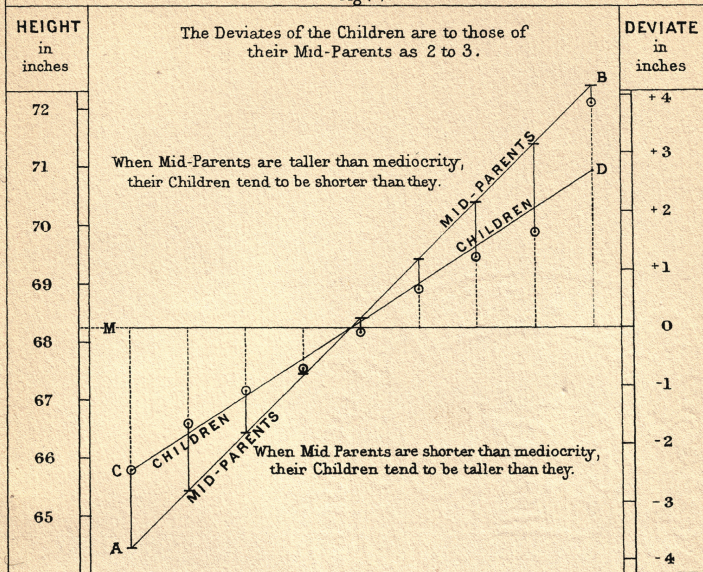


TABLE I.

NUMBER OF ADULT CHILDREN OF VARIOUS STATURES BORN OF 205 MID-PARENTS OF VARIOUS STATURES.

(All Female heights have been multiplied by 1.08).

Heights of the Mid-parents in inches.	Heights of the Adult Children.														Total Number of		Medians.
	Below	62.2	63.2	64.2	65.2	66.2	67.2	68.2	69.2	70.2	71.2	72.2	73.2	Above	Adult Children.	Mid-parents.	
Above ..	..	..	..	..	..	..	..	..	..	..	..	1	3	..	4	5	..
72.5	..	..	..	..	..	..	..	1	2	1	2	7	2	4	19	6	72.2
71.5	..	..	..	..	1	3	4	3	5	10	4	9	2	2	43	11	69.9
70.5	1	..	1	..	1	1	3	12	18	14	7	4	3	3	68	22	69.5
69.5	..	..	1	16	4	17	27	20	33	25	20	11	4	5	183	41	68.9
68.5	1	..	7	11	16	25	31	34	48	21	18	4	3	..	219	49	68.2
67.5	..	3	5	14	15	36	38	28	38	19	11	4	..	..	211	33	67.6
66.5	..	3	3	5	2	17	17	14	13	4	..	..	..	..	78	20	67.2
65.5	1	..	9	5	7	11	11	7	7	5	2	1	..	..	66	12	66.7
64.5	1	1	4	4	1	5	5	..	2	..	..	..	..	..	23	5	65.8
Below ..	1	..	2	4	1	2	2	1	1	..	..	..	..	..	14	1	..
Totals ..	5	7	32	59	48	117	138	120	167	99	64	41	17	14	928	205	..
Medians ..	..	..	66.3	67.8	67.9	67.7	67.9	68.3	68.5	69.0	69.0	70.0	..	..	..	..	..

NOTE.—In calculating the Medians, the entries have been taken as referring to the middle of the squares in which they stand. The reason why the headings run 62.2, 63.2, &c., instead of 62.5, 63.5, &c., is that the observations are unequally distributed between 62 and 63, 63 and 64, &c., there being a strong bias in favour of integral inches. After careful consideration, I concluded that the headings, as adopted, best satisfied the conditions. This inequality was not apparent in the case of the Mid-parents.

FAMILY HEIGHTS. from R.F.F.  
(Add 60 inches to every entry in the Table)

	Father	Mother	Sons in order of height	Daughters in order of height
1	12.5	7.0	13.2	9.2, 9.0, 9.0
2	15.5	6.5	13.5, 12.5	5.5, 5.5
3	15.0	abt 4.0	11.0	8.0
4	15.0	4.0	10.5, 8.5	7.0, 4.5, 3.0
5	15.0	-1.5	12.0, 9.0, 8.0	6.5, 2.5, 2.5
6	14.0	8.0		4.5
7	14.0	8.0	16.5, 14.0, 13.0, 13.0	10.5, 4.0
8	14.0	6.5		10.5, 8.0, 6.0
9	14.5	6.0		6.0
10	14.0	8.5		5.5
11	14.0	2.0	14.0, 10.0	8.0, 7.0, 7.0, 6.0, 3.5, 3.0
12	14.0	1.0		5.0
13	13.0	7.0	11.0	2.0
14	13.0	7.0	8.0, 7.0	
15	13.0	6.5	11.0, 10.5	6.7
16	13.0	abt 5.0	12.0, 10.5, 10.2, 10.2, 9.2	8.7, 6.5, 4.5, 3.5
17	13.0	4.5	14.0, 13.0, 11.5, 2.5	6.5, 2.3
18	13.0	4.0		6.0, 4.5, 4.0
19	13.2	3.0		2.7
20	12.7	4.0	13.2, 13.0, 12.7	10.0, 4.0, 2.5, 2.0, 6.0
21	12.0	8.0	13.0	2.5, 2.0
22	12.0	abt 7.0	13.0, 11.0	7.0
23	12.0	5.0	14.2, 10.5, 9.5	6.0, 5.5, 5.0, 5.0
24	12.0	5.5		5.5



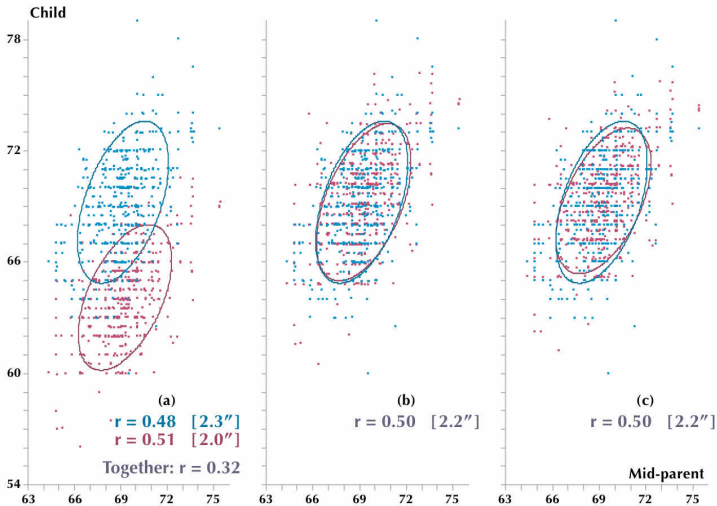
No	Father	Mother	Sons in order of height	Daughters in order of height
25	10.5	3.0	12.5, 4.0, 7.0	4.5, 4.0
26	10.0	3.5	11.0, 7.5	7.5, 3.5
27	10.0	3.0	8.0, 7.0	3.7, 2.0
28	10.0	3.0	10.0, 6.5	2.6, 1.0
29	10.5	2.0	12.0, 10.0, 9.5, 9.5, 8.0	5.0, 4.0, 3.0
30	10.3	2.7	10.7, 9.7, 9.2, 8.2	4.0, 3.5, 3.2
31	10.5	2.0	abt 12.0, abt 12.0	0.0
32	10.0	1.0	11.2, 7.0	Null
33	10.0	0.0	7.0, 4.5	5.0, 3.0
34	abt 10.0	0.0		5.0, abt 5.0
35	10.0	-1.5	11.5, 4.5	5.0, deformed
36	10.0	-2.0	12.0, 6.0	6.0, 5.0, 3.0
37	9.0	8.5	15.0, 11.0, 10.0	6.0, 6.0, 5.5, 5.0, 5.0, 4.0, 4.0
38	9.0	7.0		4.0
39	9.0	6.0	13.0, 12.0, 11.7, 11.5	5.5, 5.0, 2.7, 2.5
40	9.0	6.0	11.2, 11.0, 10.0	
41	9.0	6.7	13.0, 14.0, 12.0, 8.5	
42	9.0	6.0	10.0, 8.5, 8.0	5.0, 3.0, 2.5
43	9.0	6.5	abt 12.0, 11.0, abt 10.0, abt 10.5, 7.0, 6.0	abt 1.0
44	9.5	6.5	10.5, 7.5	4.5, 4.0
45	9.0	6.5	11.0	8.5, 7.5, 6.0, 3.0, 3.0
46	9.5	6.0	11.0, 11.0, 10.5, 10.5	6.5, 5.5, 4.5
47	9.0	6.0	13.0, 12.0, 4.0, 9.0	6.5, 3.5, 3.5, 3.0, 4.0
48	9.0	5.0	10.0, 8.5, 7.0	5.0, 4.0, 3.5, 1.0
49	9.5	4.5	9.7, 8.0, 6.0	5.2, 4.5, 2.7, 0.0
50	9.2	abt 4.0	11.7, 6.5	5.0, 3.5
51	9.0	3.5		5.5
52	9.0	3.0	9.0	7.5, 3.5
53	abt 9.0	3.0	12.0	
54	abt 9.0	abt 3.0	13.0, 10.0, 10.0, abt 4.0	abt 6.0, 2.0

No	Father	Mother	Sons in order of height
73	6.0	7.0	12.0, 5.0,
74	6.0	6.0	9.0, 5.0,
75	6.0	6.0	12.0, 2.0,
76	6.5	5.0	12.0, 11.5, 11.0,
77	6.0	5.5	12.0, 11.0,
78	6.0	3.0	16.0
79	6.0	3.5	
80	6.5	3.0	7.2, 7.0,
81	6.5	2.5	10.0, 8.0,
82	6.0	1.5	16.0
83	6.0	6.0	8.0, 7.0,
84	6.0	6.0	5.5
85	6.0	-1.0	8.0, 7.0, 0.0,
86	5.0	7.0	6.5, 6.0,
87	5.0	7.0	
88	5.0	6.0	3.0
89	5.0	6.0	7.0, middle
90	5.0	5.0	10.0
91	5.0	5.0	10.7
92	5.0	5.0	9.5, 9.0,
93	5.0	4.0	7.0, 7.0,
94	5.0	3.0	10.0
95	5.0	3.0	6.0, 6.0,
96	5.5	3.0	11.0, 11.0,
97	4.0	3.0	10.5,
98	4.0	3.0	4.5
99	4.0	0.0	8.0, 8.0,
100	4.0	0.0	6.0





# "Transmuting" of Female Heights



Heights (in inches) of adult children in relation to their mid-parent height. (a) each daughter's height 'as is' (b) daughter's height multiplied by 1.08 (c) 5.2 inches added to daughter's height. Daughters' heights are shown in pink, and sons' in blue, symbols. Ellipses (75%) are drawn based on the observed means and covariances.

*In all three panels, and in analyses for "Do Residuals Segregate along Family Lines?", the mid-parent height is calculated as (father's height + 1.08 x mother's height) / 2.*

[Average Residual, in inches]



## STATISTICAL PRACTICE

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- Be professional
- Communicate well
- Don't be dazzled by big data/money
- Think for yourself
- Put thinking before techniques

## LA PRATIQUE DE LA STATISTIQUE

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- Être professionnel
- Bien communiquer
- Ne pas être ébloui par les mégadonnées/l'argent
- Penser par soi-même
- Mettre la réflexion avant les techniques

# LINKS | LIENS

<http://www.biostat.mcgill.ca/hanley>  
→ Publications, Presentations, Interviews, etc.



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