







#### **National Mathematics and Statistics Conference 2022**

- 2½ years since I was invited to give this talk
- During that time some momentous things happened to me ...
  - (Arghhhh!) • I Turned 70!
  - & retired fully
    - any "teaching" is looking after our 1-year-old granddaughter

"Big talks" have been quite a part of my life ...



Slides and links at https://bit.ly/nzamt22

NZAMT 2022



#### KEYNOTES ITINERARY SINCE 2003 (on 5 continents)

ROYAL STATISTICAL SOCIETY (UK)

INTERAMERICAN STATISTICAL INSTITUTE

AUSTRALIAN STATISTICAL CONFERENCE

STATISTICAL SOCIETY OF CANADA

CANADIAN MATHEMATICAL SOCIETY

INTERNATIONAL CONFERENCE ON THE TEACHING OF STATISTICS, ICOTS (×2)

US CONFERENCE ON TEACHING STATISTICS, USCOTS (×3)

OZCOTS (AUSTRALIA)

INTERNATIONAL RESEARCH FORUM ON STATISTICAL REASONING, THINKING AND LITERACY (×3)

IASE ROUNDTABLE CONFERENCE

PRIESTMAN MEMORIAL LECTURES (NEW BRUNSWICK)

THE BELZ LECTURE (VICTORIA)

NZ STATISTICAL ASSOCIATION (×2)

WATERLOO ANNIVERSARY CONFERENCE (CAN)

NZAMT (×2)

BUT THIS IS MY LAST EVER "BIG TALK"





So, what to do in this last-ever talk after a 44-year career? I must surely have learned something!!

- I should share my accumulated wisdom!
  - (after all, that's what people do at a time like this)





#### But there's a big risk, because as we age ...





















So, what to do in this last-ever talk after a 44-year career? I must surely have learned something!!

Now NZ is in the middle of a curriculum refresh

- So I'll include some ...
  - guiding fundamentals
    - & things I care about (and hope you will too)
  - forecasting: from trends I see in the discipline, and in the wider society
- · punctuated with ...
  - Music clips (this is the home of WOMAD!)
  - and a little self-indulgent mining of my "back catalogue"



Slides and links at https://bit.ly/nzamt22





- So I'll include some ... - guiding fundamentals
  - & things I care about (and hope you will too)
- forecasting: from trends I see in the subject and wider society

Inevitably, this will all be ...









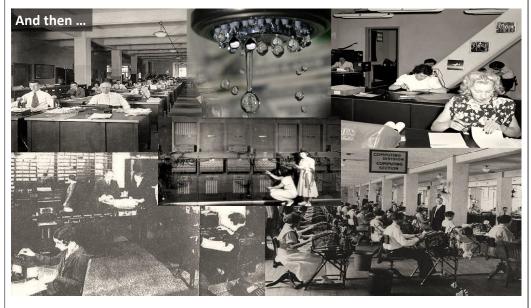






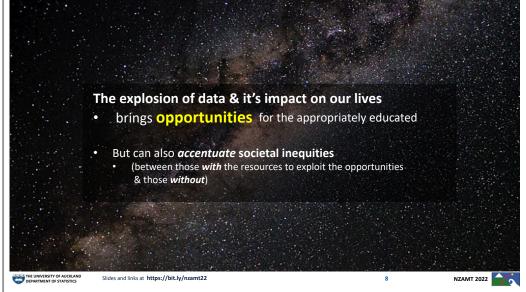




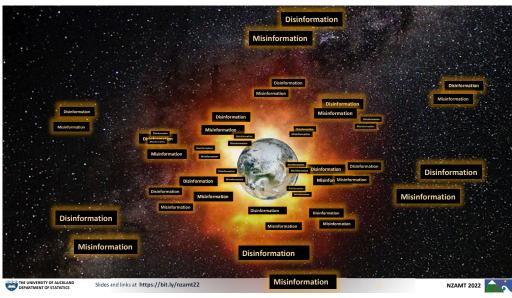








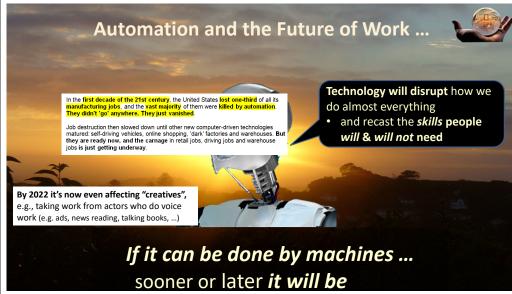












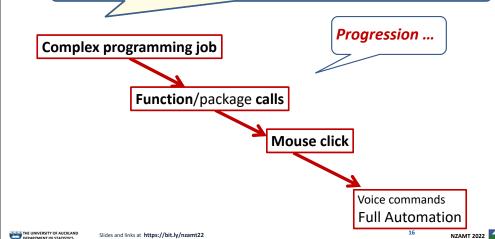


#### In the data world ...

# Software is making more things easier for more people

- Everywhere software people are trying to do this
  - (free software) The whole R-package culture is about this
  - (commercial software) The driver is saleable products
  - -Automation, esp involving Machine Learning/Artificial Intelligence
    - bigger and more powerful black boxes (has some huge downsides)

Consequences for our students' lives and careers are enormous



"Today's programming job is tomorrow's mouse-click"



# Your At skills are worth less than you think" Data Science/Statistics/Maths

Your AI skills are worth less than you think



https://www.kdnuggets.com/2019/01/your-ai-skills-worth-less-than-you-think.html

As exciting as the progress is, it's bad news for both companies and individuals who have invested heavily in Al skills.

Today, they give you a solid competitive advantage, as training a competent ML engineer requires plenty of time spent reading papers, and a solid math background to start with.

However, as the tools get better, this won't be the case anymore. |t'|| become more about reading tutorials than scientific papers.

If you don't realize your advantage soon, a band of interns with a library may eat your lunch.



Slides and links at https://bit.ly/nzamt22





# International Data Science in Schools Project

**Curriculum Frameworks for** 

### **Introductory Data Science**

IDSSP Curriculum Team

(for the last 2 years of high school)

September 2019

Endorsements of Frameworks (so far)













Slides and links at https://bit.lv/nzamt22





# International Data Science in Schools Project (IDSSP)

DS Curriculum Topics *not* in std intro stat

- **Data-handling Pipeline**
- Dynamic visualization, multiple variables
- Interactive visualization
- Inference via bootstrapping & randomisation

Slides and links at https://bit.lv/nzamt22

- Time series data
- Map data (data relating to geographic locations)
- **Text data** (from pieces of text tweets, comments, articles, books, ...)
- Machine Learning: Supervised ("predictive analytics")
- Machine Learning: Unsupervised (clustering "like" with "like")
- **Image Data** (from images)
- Recommender systems
- Network data (coming)



Including a significant emphasis on code writing







### **International Data Science in Schools Project (IDSSP)**

DS Curriculum Topics not in std intro stat

- Data-handling Pipeline
- Dynamic visualization, multiple variables
- · Interactive visualization
- Inference via bootstrapping & ra
- Time series data
- Map data
- Text data
- Machine Learning: Supervised
- Machine Learning: Unsupervise
- Image Data
- Recommender systems
- Network data

Slides and links at https://bit.ly/nzamt22



**Data-handling Pipeline** 

- Dynamic visualization, multiple variables
- Interactive visualization
- Inference via bootstrapping & randomisation
- Time series data
- Map data
- Text data
- **Machine Learning: Supervised**
- Machine Learning: Unsupervised

- Network data (coming



What makes this achievable is software that automates the details

I've done enough work on these, and software prototypes for them, to see that some *serious practical capabilities* in all of these areas can be within the grasp of high school students

Slides and links at https://bit.ly/nzamt22







# **Increasing numbers of areas** are becoming "just like driving a car"



• And for them ...

# ... Society needs ... lots *more* people ...

- to be good at this
- than this

And you can be

very good at this

Without being

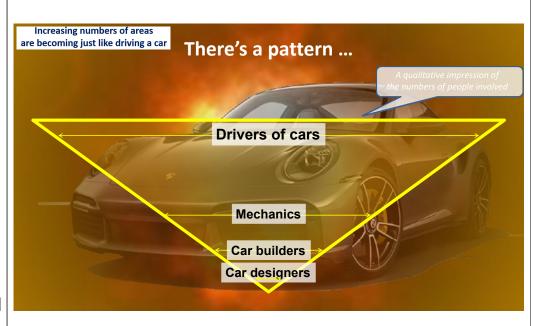
much good at this

THE UNIVERSITY OF AUCKLAND
DEPARTMENT OF STATISTICS
Slides and links at https://bit.ly/nzamt22



& vice versa!





### Educationally, we do a lot of ...







And little, if any, of ...







We aren't as bad as others internationally





Big consequences of increasing automation for students' lives and careers ...

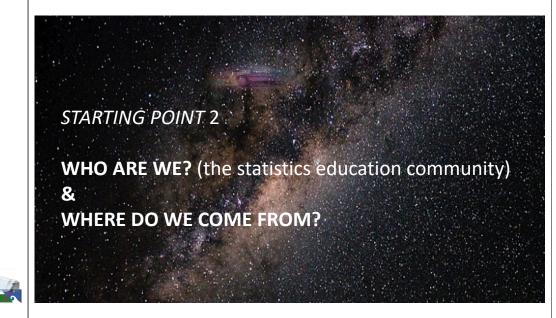


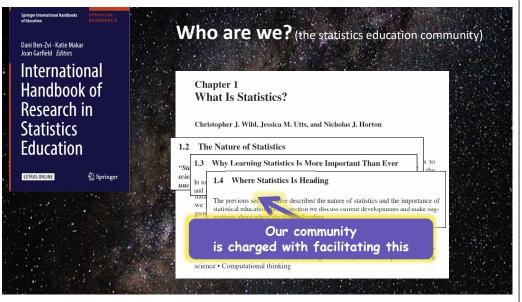
What do we need for future-proofing our children/students?

The ability to do things machines can't do!



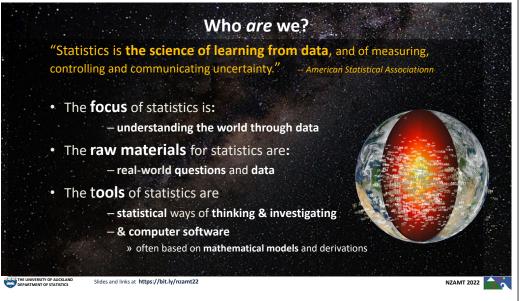
Slides and links at https://bit.ly/nzamt22

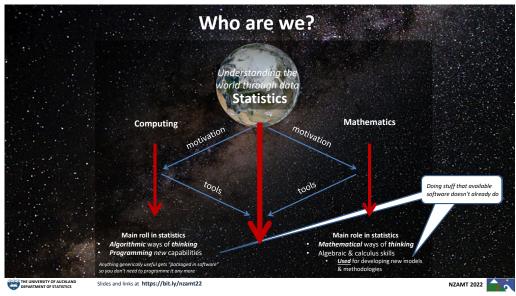


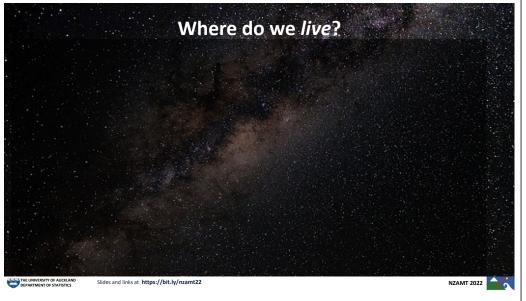


#### **Preparing students for**

- Data capabilities for life and work
  - Understanding data-based displays and arguments
  - Investigative skills
  - Capabilities in data harvesting, data wrangling and data analysis
  - Ethical behaviour in collection, storage and use of data
- Protecting themselves from
  - the deluge of disinformation & misinformation
    - · Scepticism and critique





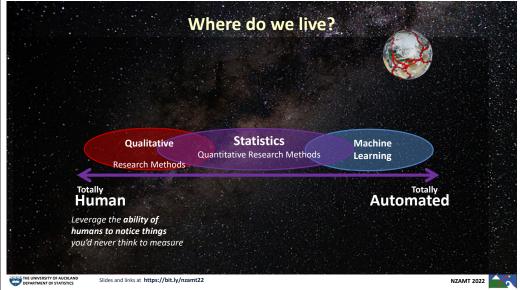








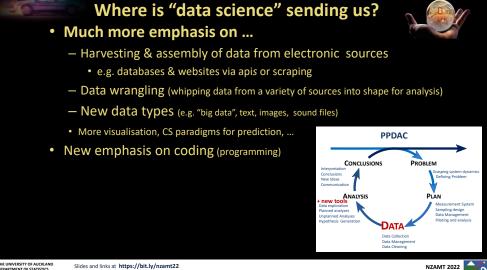














#### Let's return to this ...

The explosion of data & it's impact on our lives

- brings opportunities for the appropriately educated
  - or those who can afford to buy in data and analytics
- But could also accentuate societal inequities
- (between those that have the resources to exploit opportunities & those who don't)

Harvard Data Science Review • Issue 3.2. Spring 2021 On Democratizing Data **Science: Some iNZights Into Empowering the Many** 

Adding in

& emphasize

Chris J. Wild<sup>1</sup>. Tom Elliott<sup>1</sup>. Andrew Sporle<sup>1</sup>

Adding in

& worry about .

Slides and links at https://bit.ly/nzamt22



# "Democratizing data" is ...

Slides and links at https://bit.ly/nzamt22



# "empowering the many"



## Let's return to this ...

The explosion of data & it's impact on our lives

- brings opportunities for the appropriately educated
- or those who can afford to buy in data and analytics
- But could also accentuate societal inequities
- (between those that have the resources to exploit opportunities & those who don't)

Important Kevnote at Auckland Statistics Teachers Day 2020 (Here for Video & slides



- Dep. Director of NZ Healthier Lives National Science Challenge
- Board of Int. Societogical Ass. Res. Com. on Racism, Nationalism, Indigeneity and Ethnicity
- founding member of NZ Virtual Health Information Network
- founding member of Te Mana Raraunga (Māori Data Sovereignty Network)

was inaugural Māori Health Research Manager at the Health Research Council of NZ







Harvard Data Science Review • Issue 3.2, Spring 2021

**On Democratizing Data** 

Science: Some iNZights. • \*

Into Empowering the Many









# Andrew's strong Work Relationships ...

include ...

- Statistical & Health Agencies of small Pacific nations
- Indigenous & community groups,
  - Incl. Māori Data Sovereignty Network & other national movements linked by the Global Indigenous Data Alliance
- Subject-matter researchers (esp. Health, Social Science & Official Statistics )

#### **COMMON REFRAINS**

- Big statistical & data science needs, but ...
  - No People
  - No Money
  - No Time
    - Or, at least, very little of these things

Slides and links at https://bit.ly/nzamt22



overwhelmed by: · needs at home





Greta Thunberg ... "While we may all be in the same storm, we are not all in the same boat"

> On Democratizing Data Science: Some iNZights Into Empowering the Many

- Unmet needs of those lacking in money and data education are every bit as important as those who have more cf. "doctors without borders"
- Volunteers like **Statistics Without Borders** (pro bono services)
  - as a solution, it cannot scale will never be enough volunteers
- Need to empower more people to do more for themselves



Slides and links at https://bit.lv/nzamt22











THE UNIVERSITY OF AUCKLAND DEPARTMENT OF STATISTICS



# **Democratising Data/Data Science/Analytics**



Enterprise Research Service

"Enabling people to access data is one thing.

But empowering them to do something intelligent
with the data, that's democratization of analytics"

Research Brief

The Democratization of Analytics

October 2015 Written by:

Bernard Blais, Senior Manager, Global Technology Practice, SAS

Robert Morison, IIA Faculty

We need to democratize data skills to "empower the many"!



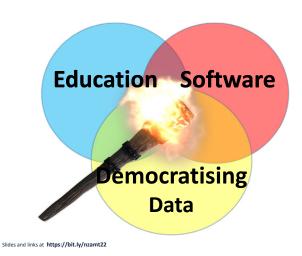




DEPARTMENT OF STATISTICS

Slides and links at https://bit.ly/nzamt22

### What I care about



So how can we empower the many?



• Education!!!!

-That's us ... isn't it?

-We've got this ... haven't we?

-Sorted!!



-Why not ????

THE UNIVERSITY OF AUCKLAND

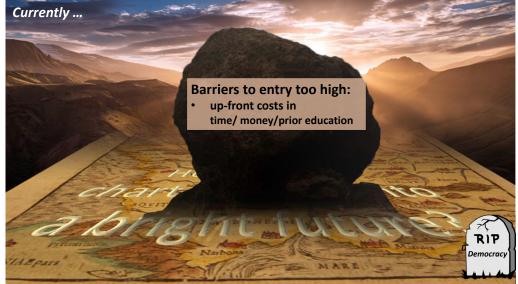
NZAMT 2022

Slides and links at https://bit.ly/nzamt22

NZAMT 2022







#### **Problems for generalists** who become "part-time Statisticians"

little data-related education

"So give them more education!!"

time-poor

Catch 22!! Gotcha!

so acquiring knowledge is strangling bottleneck

And generalists:

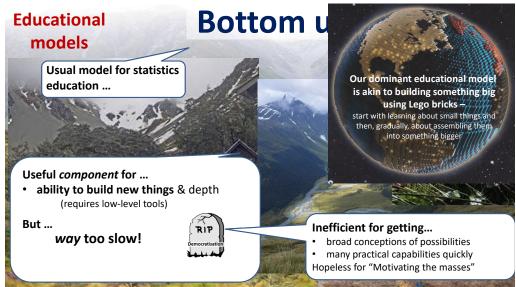
- do many different things
- often work in processes infrequently
  - → rapidly fading memories of how to do things and what they mean



Lack of up-front knowledge & fading memories major factors to work around

Slides and links at https://bit.ly/nzamt22







#### For democratization

We need education & software interfaces that take account of these realities ...



- rapidly fading human memories (what's been "learned" mostly gets forgotten)
- increasing automation
- Leads to trying to do the following ...
  - Answer, "What is the minimal knowledge someone needs for this?"
  - Enable working from that with intelligent GUIs that ...

· Automate decisions whenever good defaults exist

**Graphical User Interfaces** 

**Education Software** 

emocratising

- But allow users to override defaults (and do things differently)

- · Guide them through thinking/decision processes supplemented by just-in-time information
- Move cognitive & human-memory load from non-essentials to understanding what data is saying and the implications of that for action



Slides and links at https://bit.lv/nzamt22







#### For democratization

- We need education & software interfaces that take account of these realities ...
  - too little time to learn "all you'll need"
  - rapidly fading human memories (what's "learned" mostly gets forgotten)
  - increasing automation
- Educationally we need internalised big-picture conceptions as scaffoldings to hang on ...
  - what things are
  - how they interrelate
  - what sorts of things can be done / what things can do
  - what things mean
- Else, post formal-education, there will be a dearth of relevant memories to act as starting points for approaching practical problems





#### For this ...



Big-picture conceptions ... have long-term value



• Details are death dated

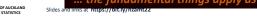






Question: "... You must remember this If only 5% of what you "teach" is going to stick long-term, what should that 5% be??











### "The problem of names"



In most statistical systems ...

- can't do anything 'til you know/remember, its name
  - Barrier to getting started
  - Big time-losses getting back up to speed after a period of inactivity





Slides and links at https://bit.ly/nzamt22

Very useful systems







#### Let's return to this slide ....

• and then talk about some development that's been done

#### International Data Science in Schools Project (IDSSP)

DS Curriculum Topics not in std intro stat

- · Data-handling Pipeline
- · Dynamic visualization, multiple variables
- · Interactive visualization
- · Inference via bootstrapping & randomisation
- · Time series data
- Map data
- Text data
- · Machine Learning: Supervised
- · Machine Learning: Unsupervised
- Image Data
- · Recommender systems
- Network data







**Specialist modules** 

My efforts towards solving these problems ...

has mainly been in the iNZight project <a href="https://inzight.nz">https://inzight.nz</a>

Online equivalent

often using grad students and their Masters and Hons dissertations

+ research vehicle for prototyping new ideas

ossinzight Desktop software

**inzight** lite

to create prototypes for new data areas

- Data-handling Pipeline (heaps of useful tools)
- Time series data ("done")
- Map data ("done")
- Text data (ready to go)
- Machine Learning: Supervised (prototyped)
- Machine Learning: Unsupervised (prototyped)
- Interactive visualization (interactive versions of most plots already implemented)
- Network data (prototyped)
- Image Data (experimenting)
- Recommender systems (probably won't do)

- PLUS OTHER "ADVANCED" CAPABILITIES
- Extensive data-wrangling capabilities ("done" & writing R code)
- writing R code)

  & survival analysis

  Generalized Linear Models ("done" & writing R code)
- Data from complex surveys ("done" and integrated)
- Data from designed experiments ("done", Lite only)
- Multivariate-y data ("done")
- Multiple-response data ("done")
- Epidemiological tools ("done")
- Longitudinal data (prototyped)
- Hierarchical data (innovative graphics developed)



Slides and links at https://bit.ly/nzamt22

Slides and links at https://bit.lv/nzamt22



:88 inzight & :88 inzight lite





#### Other developments

New capabilities to cater for ...

Growing Up in New Zealand is this country's largest contemporary longitudinal study of child development. We're tracking the lives of more than 6,000 Kiwi children to discover what life is like growing up in 21st Century New Zealand"

- Integrating R coding and GUI-driven operations, system-written R-code (to help with learning to code, providing audit trails, and supplying code bocks for use in programs)
- Becoming the primary analysis tool for the researchers in ...
  - The Growing Up in New Zealand longitudinal study (2004 ...)
  - And some other major NZ studies

"Give me the R code for what I've just done"

- Time series rewritten to have professional-level capabilities (back-end completed)
- & also work on small area estimation
- esp. to cater for small Pacific countries etc
- Requests by
  - the Australian Bureau of Statistics
  - Stats NZ in preparation for running in their Data Labs

Slides and links at https://bit.ly/nzamt22

Slides and links at https://bit.ly/nzamt22

No time to talk about any of these areas in detail

Topics in IDSSP that are not in std intro stat

 Data-handling Pipeline (many useful tools) Time series data ("done")

· Machine Learning: Supervised (prototyped)

· Machine Learning: Unsupervised (prototyped)

Interactive visualization (interactive versions of

· Recommender systems (probably won't do)

 Map data ("done") Text data (ready to go)

Image Data (experimenting)

• Instead I'll use what we've already experienced in time series as an example of what can happen more generally

**Specialist modules** 

inzight & inzight lite

Late breaking: Bayesian small-area estimation

PLUS OTHER "ADVANCED" CAPABILITIES

Extensive data-wrangling capabilities ("done" &

Generalized Linear Models ("done" & writing R of

Data from complex surveys ("done" and integrated

 Data from designed experiments ("done", Li Multivariate-v data ("done")

Multiple-response data ("done"

Enidemiological tools ("done")

 Hierarchical data (progress on in --- Longitudinal data (prototyped)

NZAMT 2022

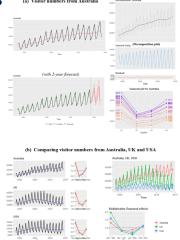


#### **Lessons from Time Series**

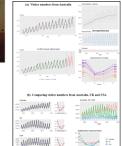
- The experience used to be mainly about ...
  - Calculating moving averages, essentially by hand, in a spreadsheet
    - Low value for revealing what a time series is telling us
- Starting about 10 years ago ...
  - a big-picture conceptualising of time series
    - in terms of trend + seasonal swings + residuals and graphical tools that can
    - reveal the patterns, and anomalies, in seasonal time series
    - · and make predictions
    - providing powerful tools for data exploration and discovery
  - experience is about "what the data is telling us"

Slides and links at https://bit.lv/nzamt22

with graphics that are understandable at senior secondary







This work has revealed that the same sort of thing

- can be done for almost all of these areas ...
- each with **their own big-picture ways of thinking** about the data (cf. trend + seasonal swings + residuals) and their own distinctive types of graphics
- conferring serious real-world capabilities

Slides and links at https://bit.ly/nzamt22

in ways that are accessible to senior secondary students





#### Lessons from Time Series cont.

#### We have a proclivity for ....

- taking something  $\it potentially~\it exciting~\it ...$
- & making it akin to wading through a swamp

#### Nice if we could also learn from our mistakes ...

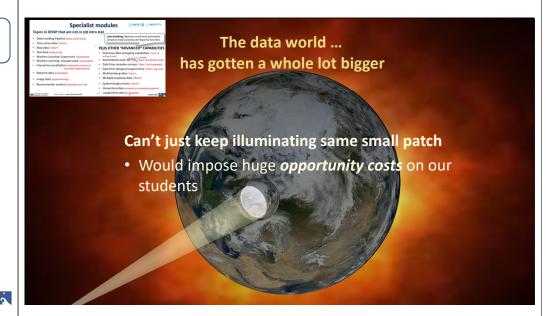
- Assessment focussed on writing about one time series
  - that then also had to have "all the features" so students could score marks
    - an extended, & regimented, experience of "one thing"
- This is *not* what learning for exploration and discovery looks like ...
   It needs ...
  - Exploration of many data sets ...
    - spotting different types of features (& wrinkles) in situ
    - thinking about what they might be telling us about the world
- Excitement can build from repeatedly making discoveries
  - in a short timespan (because of short student attention-spans)
  - without too much effort (few have patience for prolonged, concentrated, unrewarded effort)

THE UNIVERSITY OF AUCKLAND DEPARTMENT OF STATISTICS

Slides and links at https://bit.ly/nzamt22

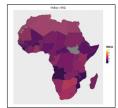
77

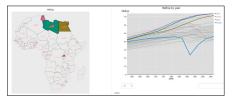


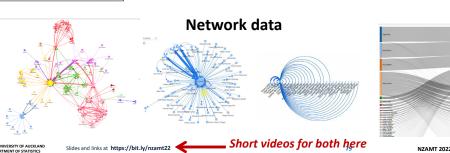


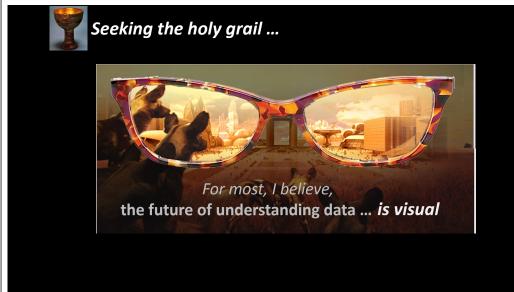
#### Data on maps















**BEST BEFORE** 

31-12-2025

**BEST BEFORE** 

31-12-2025

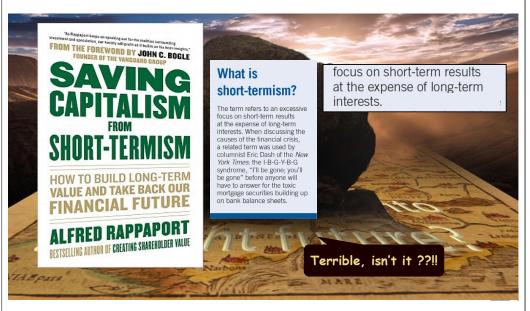
**BEST BEFORE** 

31-12-2025



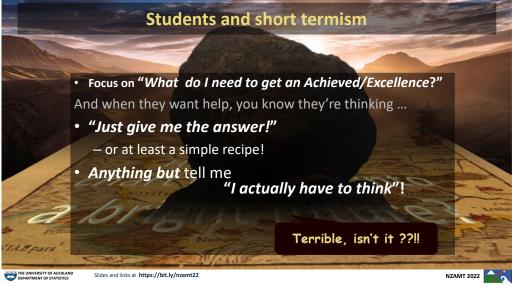






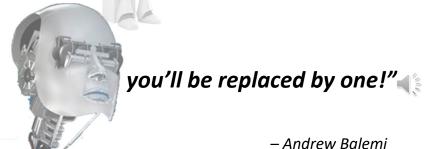








"If you can only think like a robot ...









#### But actually, It's not just students!

- We're all short-termists too
  - The reward systems we work under reinforce that
    - Get it done
    - Not-too-bad evaluations
    - Go on to something that counts more
- But that shouldn't entirely define us ...
  - "the greater good" often comes from considering the longer term

THE UNIVERSITY OF AUCKLAND
DEPARTMENT OF STATISTICS

Slides and links at https://bit.ly/nzamt22







#### The Future of Work ...



#### Theorem:

- Just about the only constant will be change
  - and the pace of change is accelerating

Slides and links at https://bit.ly/nzamt22

• "the only constant is change" —Heraclitus, 500 BC

### **Corollary:**

• **Everyone** will have to be **a life-long learner** 

The Future of Work ...





We've seen this ...

What do we want for our students?

The ability to do things machines can't do!



#### For this ...



and this ...

**Big-picture conceptions ...** 

have long-term value

Details are death dated

Slides and links at https://bit.ly/nzamt22









The ability to do ...

Continuing in this vein ...

Mathematical derivations ...

The Future of Work

has long-term value

The ability to do ...

any particular mathematical derivations

is **death dated** 



The skills' value comes from the ability to produce new theory and new methods



#### The Future of Work



The ability to operate ...

recipe a procedure ... algorithm

has long-term value



The ability to operate ...

any particular procedure ... is death dated

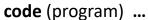


The skills' value comes from the ability to do things not yet overtaken by software



The Future of Work





has long-term value

The ability to ...

code (program) ...

anything particular (in any particular language)

is death dated



The skills' value comes from the ability to code things not yet catered for by existing and accessible software

Slides and links at https://bit.ly/nzamt22



#### The Future of Work



But, the ability to devise new ...

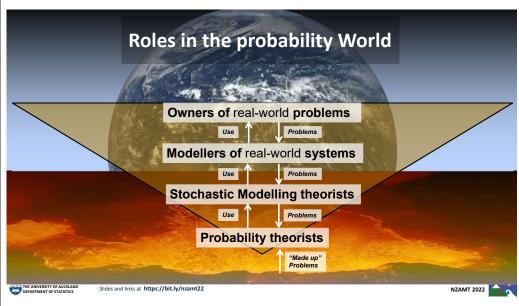
recipes procedures ... algorithms theory models ....

Slides and links at https://bit.ly/nzamt22

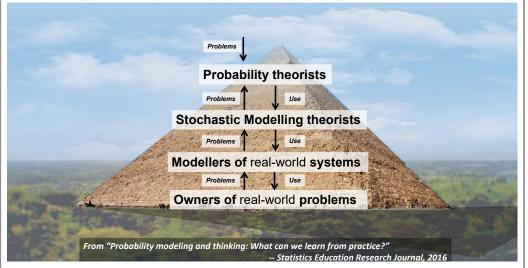


But a small pool of people capable of doing it





# Roles in the probability World



## The Future of Work



Now, while ...

But, the ability to devise new ...

recipes procedures ... algorithms theory models



has **HUGE long-term value** 

But a small pool of people able to do it

Slides and links at https://bit.lv/nzamt22



#### The Future of Work



The ability to uncover and navigate ...

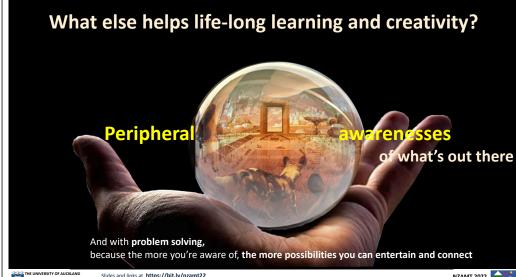
Slides and links at https://bit.ly/nzamt22

Human dimensions ...



And need everyone's

involvement













What is the single best thing we can do for our students?







