



Statistics Canada
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Microsimulation and public policy. Issues and prospects

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martin@spielauer.ca

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Outline



- What is Microsimulation?
- Microsimulation at Statistics Canada
- Examples
- Conclusions

Why do we simulate?



Perhaps consciousness arises when the brain's simulation of the world becomes so complete that it must include a model of itself. - *R. Dawkins, in "The selfish gene"*

- Simulation = creation and the use of models pursuing a purpose:
 - Exploration
 - Prediction
 - Problem-solving
 - Training
 - Explanation and theory building
 - Raising consciousness
- Many policy questions can only be answered using simulation

What is Microsimulation?



- **Social science microsimulation:** Computer-simulation of a society or economy in which the population is represented by a large sample of its individual members and their behaviors

When does MS make sense?



If individuals are different and differences are given importance

- No single representative agent
- Study and projections of distributions

If behaviors are more stable or better understood on micro level

- Non-linear tax and benefit rules
- Composition effects

If individual histories matter

- Non-Markov processes: agents have a memory
- Pension projection: contribution history

Where is it used?

- Tax-Benefit analysis
- Pension
- Education
- Population projections
- Health
- Spread of diseases
- Care
- Personnel planning



Why MS at Statistics Canada?



Increase (policy) relevance of data collected by STC

- Data from a single source often can't answer all questions related to a change in policy
- MS allows (and requires) the integration of various data into a coherent platform

Makes data more accessible

- Confidential micro-data might be releasable when integrated into a synthetic database

Data quality

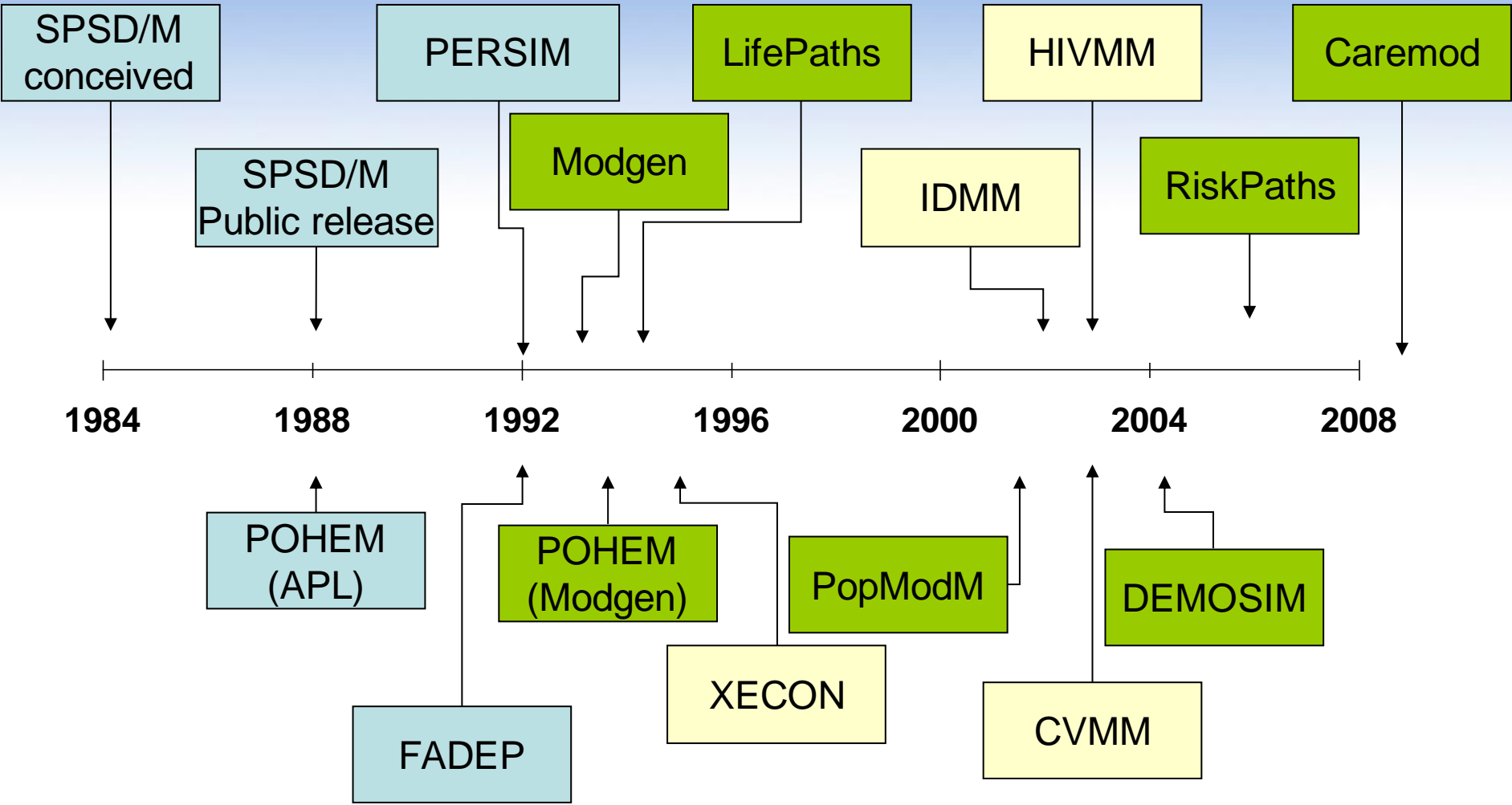
- Detection of data gaps and inconsistencies
- Internal data analysis and modeling expertise together with close client relations feed back

Microsimulation at Statistics Canada



- Long history going back to 1984
- Large variety of modes (15+; e.g.):
 - Static tax benefit model: **SPSD/M**
 - Large “multi-purpose” socio-economic model: **LifePaths**
 - Population projection model: **Demosim**
 - A growing family of health models: **Pohem**
- **Modgen** modeling technology and programming language
 - “Common language” at STC
 - Worldwide use
- Provision of modeling support, collaborations & consultancies
 - Academia – Governments – International Organizations

Time Line



Who at STC develops MS models?



Modeling Division

- Socio-economic models: LifePaths, SPSD/M
- Modeling technologies: Modgen
- Internal and external modeling support, model prototypes

Health Analysis Division

- Fast growing family of health and disease models
- Various academic and other collaborations

Demography Division

- Demographic projection models

Human Resources Development Division

- Personnel models

STATIC MICROSIMULATION

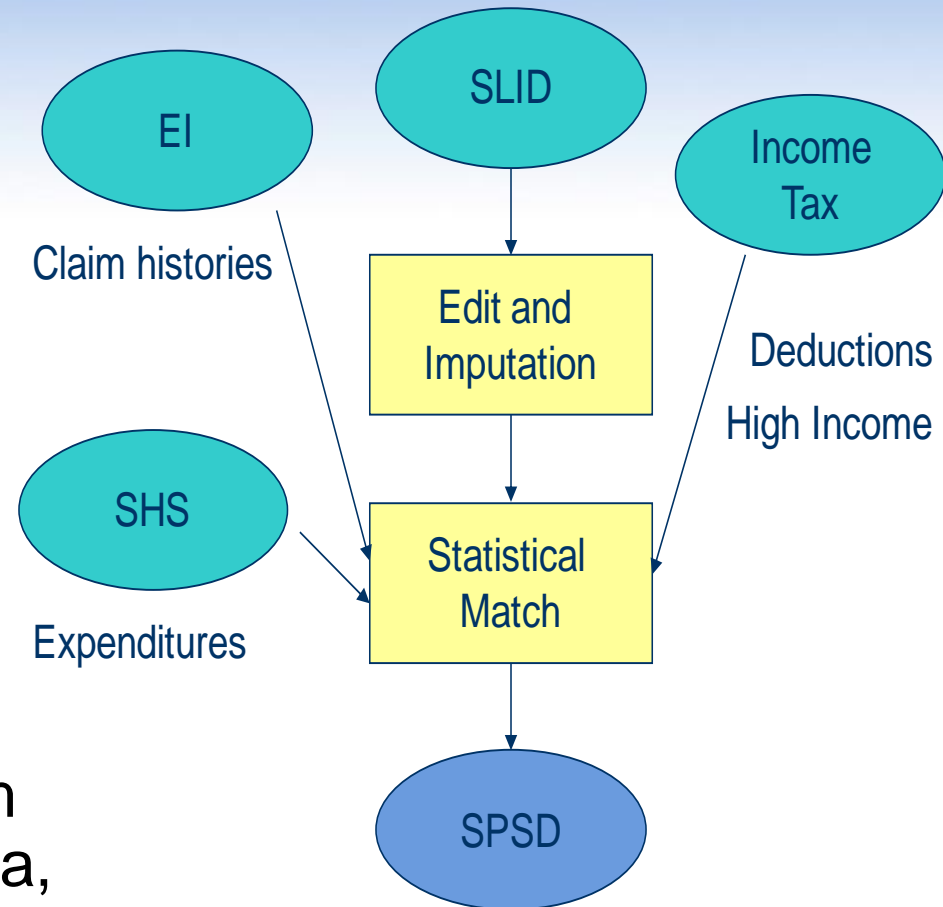
Example: SPSD/M



- Model for analysis of tax-transfer changes in a given year
- Federal & provincial transfers and taxes
 - Static accounting model - no behavioural change
 - Includes tax and transfer rules from 1991 to 2015
- Tax and transfer model is controlled by over 1600 parameters
- Includes (11) commodity taxes & consumption
- Starting database: synthetic database (~200,000 individuals) created using 4 datasets

SPSD/M: Data integration

- **Accessibility:** Releasable synthetic data from 4 sources
- **Quality:** Added insight in differences of data sources
- **Testable quality improvement:** Experiments running models on main single original data
- **Relevance:** many users!
- STC provides tool and training
- Clients run own scenarios
- Users across political spectrum including political parties, media, research institutions and Gov. Dep.



Technology

Dynamic MS introduced 1957

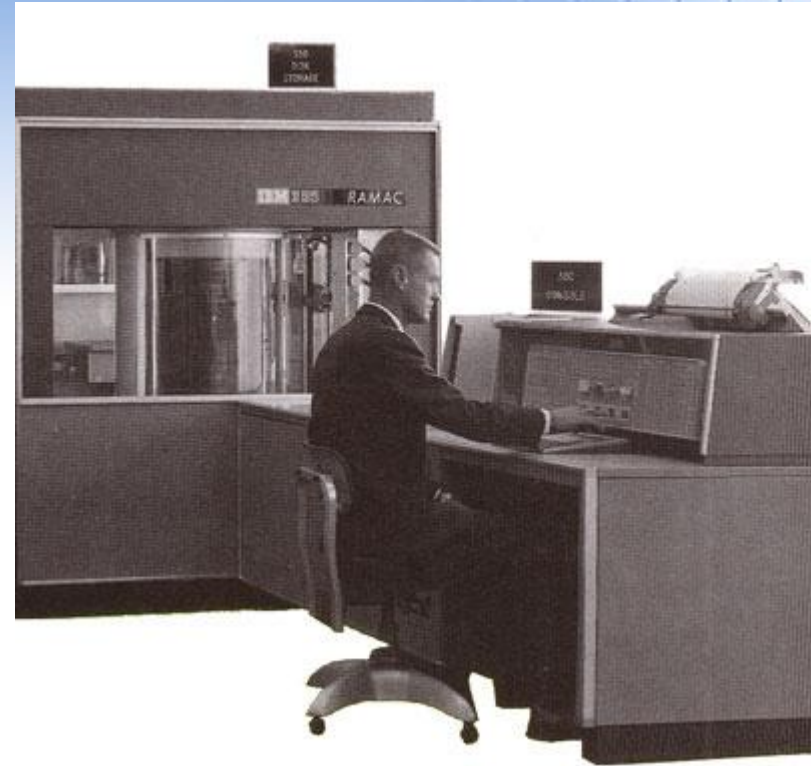
Guy Orcutt: “A new type of socio-economic system”

Impressive progress:

- Hardware
- Statistical software
- Data: Longitudinal; administrative

Programming

- Reinventing the wheel?



1956 IBM 305 RAMAC
First computer with a disk drive - fifty 24" discs – total 4.4 MB total; \$35,000/year

Modgen technology



- Modgen is a **generic MS programming language**
 - Continuous time and discrete time
 - Interacting and non-interacting populations
- It is **free** (builds on MS C++); support contracts available
- Efficient applications: **fast**; large populations; multithreading
- **Efficiency** coding: No advanced programming skills required
- **User-friendly**: Creates a stand-alone model with a complete visual interface and detailed model documentation.
- Powerful **tabulation** facilities, Standard errors and coefficients of variation for tables; Visualization of individual life courses

Modgen: User interface

The screenshot displays the Modgen software interface with several key components and annotations:

- Scenario Settings:** A callout box points to the 'Run the simulation' button (a play icon) in the top toolbar.
- Open a simulation scenario:** A callout box points to the 'Open' icon (a folder) in the top toolbar.
- Parameters organized in parameter groups:** A callout box points to the tree view on the left, which lists categories like 'Mortality parameters', 'Fertility parameters', and 'Union parameters'.
- Output tables organized in table groups:** A callout box points to the 'Table Groups' section in the left tree view, which includes 'Life tables' and 'Births'.

The main window shows a parameter configuration for 'Age baseline for first birth' with the following table:

Left interval border (age)	3	4	5	6	7	8
0	0.2869	0.7591	0.8458	0.8167	0.6727	0.5105

Below this, a table titled 'Probabilities of union status on first birth' is shown:

Union status	First union > 3 years	First Union > 3 years	After first union	Second union	After second union
0.0648	1.0000	0.2523	0.0648	0.8048	0.0648

Modgen: Conclusions

- Common language for MS at STC: more flexible team
- Analysts as opposed to programmers can develop and maintain models
- Efficiency in development of models
 - Avoid re-inventing the wheel
 - Shared high standards in model speed. UI, documentation
 - Less error prone
- Fast creation of prototypes one of the methods used to develop new markets
- Vehicle for teaching MS at universities



Microsimulation and Demography



- Demographic research showcases trends in social sciences and the transformative potential of microsimulation
 - From structure to processes
 - From macro to micro towards multi-level integration
- Traditional Macro projections limited to few variables. Miss need for more detailed projections; poor micro foundation
- Micro-analysis falls short of being able to assess overall impact of micro-level behaviours and changes.
- **Starting from Macro level:** MS can replicate macro models which can be stepwise refined accounting for heterogeneity
- **Starting from Micro level:** MS is the tool to add synthesis to analysis: models of single processes brought together to simulate macro dynamics

Microsimulation and Demography



- Population projections showcase one of the fundamental trade-offs in microsimulation: detail versus prediction power
 - Detail leads to specification randomness: too many variables produce noise
 - Simplicity leads to misspecification errors: too few variables, i.e., too simple models
 - Microsimulation allows scaling of models by theoretical considerations

Demosim: Context



General:

- Rapid increase in the ethno-cultural diversity
- Demand for detailed projections going beyond age and sex

Institutional:

- Funded by external federal departments (PCH, HRSDC, CIC and INAC) responsible of programs related to Employment Equity, Labour market integration, and fight against racism and discrimination

Results

- Released (2011) “Projections of the diversity of the Canadian population, 2006-2031”
- Follow-up studies, e.g. for Aboriginal Population

Demosim – Base Population & Variables

- Starting population is a 20% sample of the census (7 Mill)
- Age
- Sex
- Place of residence (33 metropolitan areas, provinces, on-off Indian reserves)
- Place of birth
- Generation status
- Visible minority group
- Mother tongue
- Aboriginal identity & Registered Indian Status
- Religious denomination
- Highest level of schooling
- Labour force participation

Demosim - “Typical modeling strategy”

- Many models follow a 2 step approach
 - Base risks / probabilities: equivalent macro models
 - Relative risks / probabilities: detailed accounting for individual characteristics
 - Fertility
 - Mortality
 - Emigration
 - Labour force participation
 - Education (indirect)
- Allows to combine robust with detailed data sources
 - Supports scenario building

Demosim: Conclusions



- Demographic microsimulation projection meets demand for more detailed projections while leaving models transparent
- The project demonstrated the strength of microsimulation in specialized projection models
- Demonstration that MS models can be developed fast with modest input of resources
- High confidence in results as all aggregate outcomes closely resemble macro projections (and differences are explainable)
- Transparent assumptions; scenarios created by clients
- Very high media coverage

Policy maker's perspective



Attractive features

- **Virtual world:** Test and fine-tune new policies
- **Detail:** Policy rules at any level of detail; distributions
- **Longitudinal perspective:** Sustainability issues

Transformative potential:

- Shift in focus on sustainability issues and time dimension
- Better understanding of trade-offs and distributions
- **Accounting:** Integration to social accounting framework

Many challenges:

- Management of complexity and randomness
- Theoretical foundation

Life Course Perspective



MS fits naturally into dominant research paradigms

- **Individual agency:** Modeling of decisions and events in context and on level they take place
- **Interaction between careers:** Life-course interactions between parallel careers within a changing socio-economic context
- **Interaction between individuals:** Family and social networks, Intergenerational and other transfers and transmission

LifePaths



- LifePaths simulates a large sample of detailed individual life courses which together represent the Canadian population in its socioeconomic diversity
- Dynamic – large - multi-purpose
- Family context: simulation of spouses, children, grandchildren

- Continuous time model
- Case based model
- Synthetic starting population
- Historic depth: first actors born 1871

LifePaths – Behaviours & Systems



- Family demographics
- Education
- Health
- Employment
- Income and earning
- Home ownership
- Social insurance
- Benefits
- Taxes
- Public pension plans
- Senior benefits (OAS, SPA, GIS)
- Private pension plans

LifePaths – Data



- The content of LifePaths is largely embodied in its behavioral equations estimated from micro data
- Challenge: both longitudinal and cross-sectional consistency
- LifePaths makes use of a multitude of data sources.
- LifePaths can be viewed as a data integration exercise

LifePaths application example: Replacement adequacy of retirement income



Motivation: concerns about the “replacement adequacy” of the retirement income system for future retirees

- declining RPP coverage for current workers
- perceived inadequate take-up of RRSP saving

Why LifePaths:

- Provides detailed distributional results:
- Complete lifetimes observable: detailed earning histories; flexibility in measuring pre-retirement earnings, e.g. best 10 years
- Allows exploration of “what-if” questions

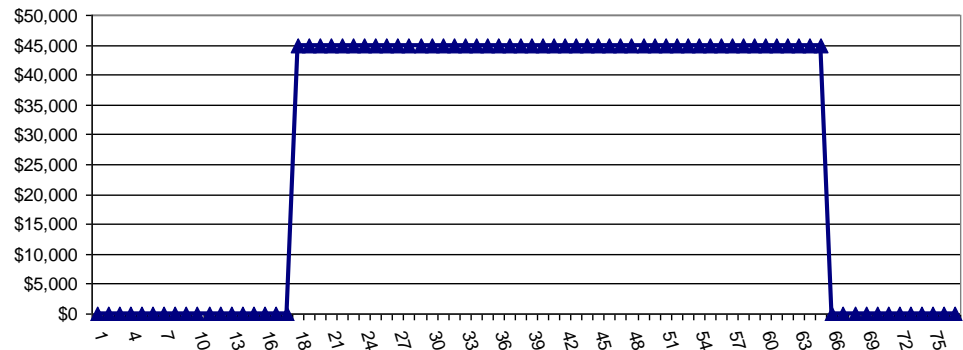
Example: Replacement adequacy of retirement income



Traditional “typical case” analysis

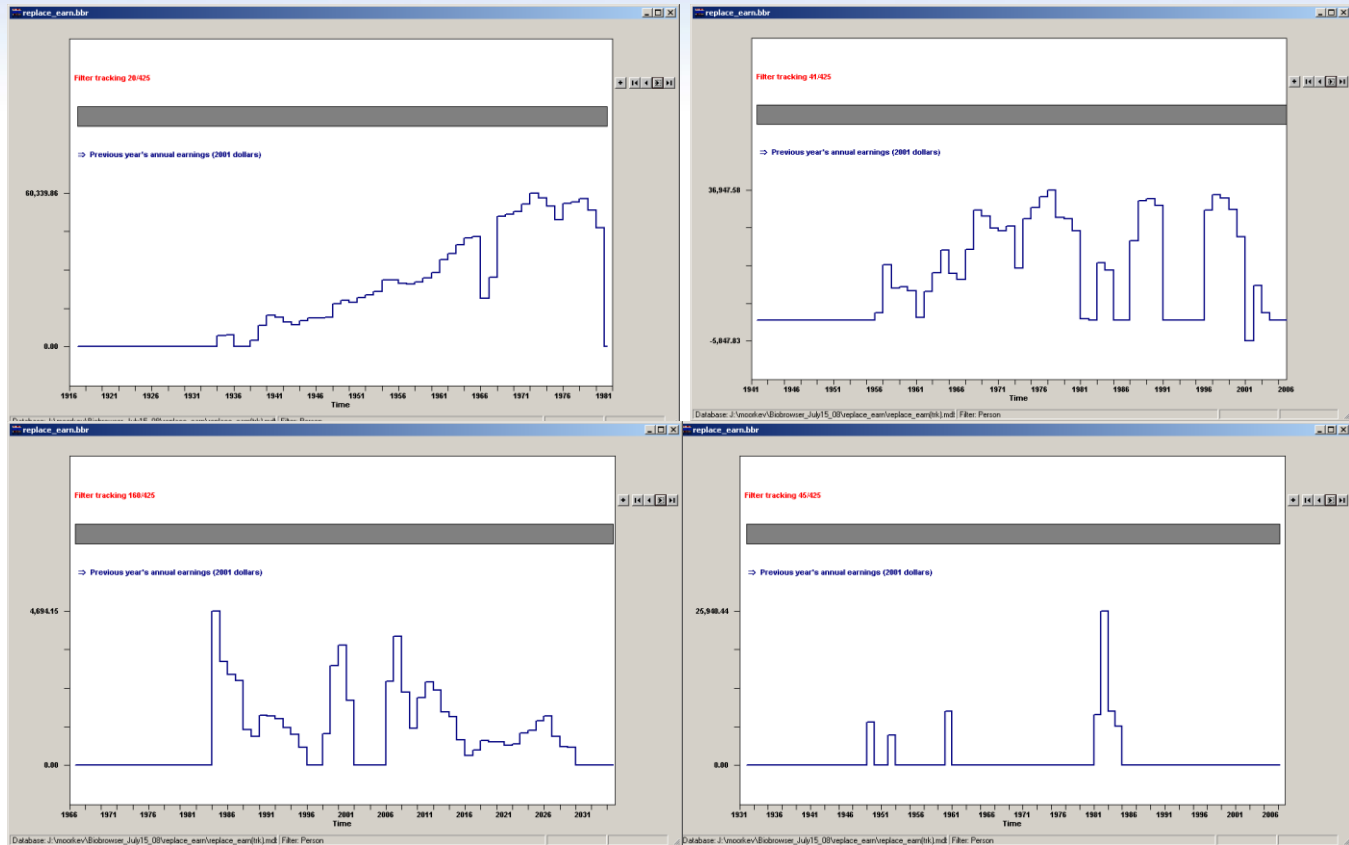
- Starts work at age 18
- Earns the average wage every year
- Stops working at age 65
- C/QPP provides a pension that replaces 25% of his/her average earnings

Annual earnings by age
(2010\$)



Example: Replacement adequacy of retirement income

LifePaths analysis: realistic careers

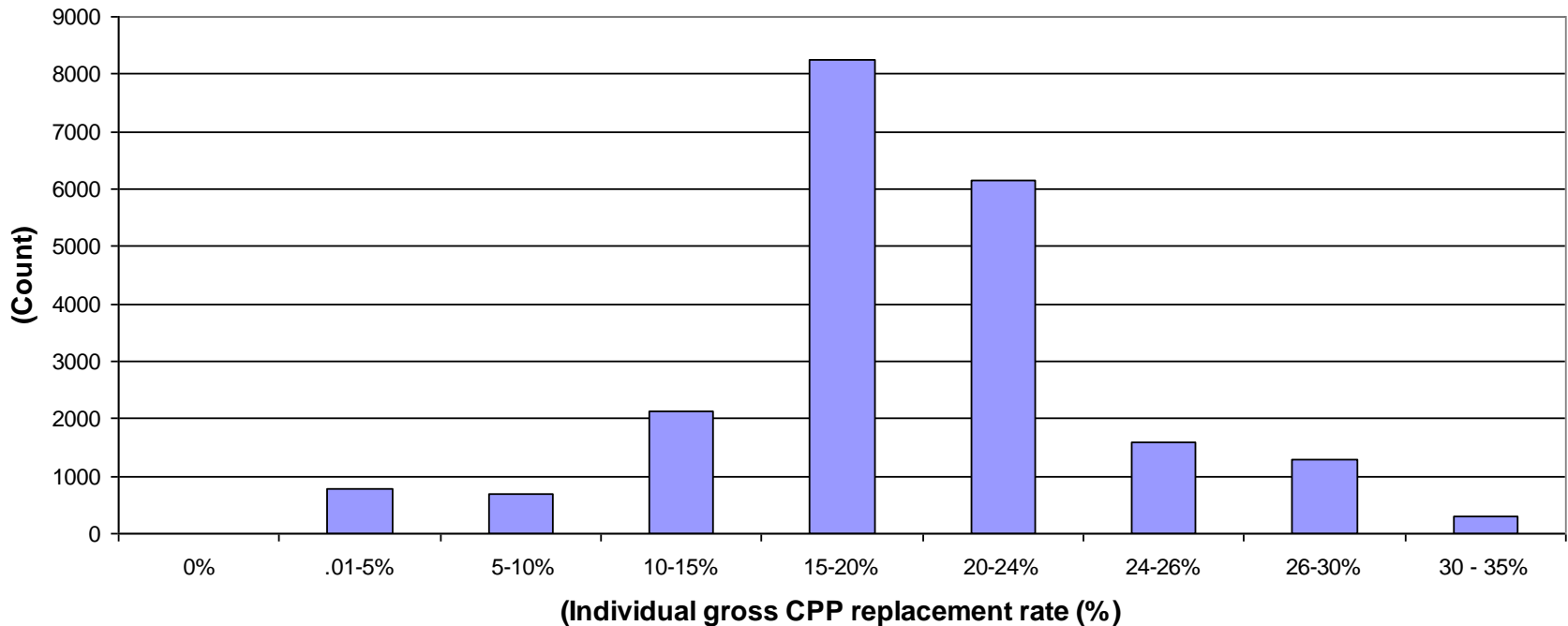


Example: Replacement adequacy of retirement income



Distributional analysis

**Distribution of gross CPP replacement rates
(Men reaching age 66 in 2005 with pre-retirement earnings near YMPE)**

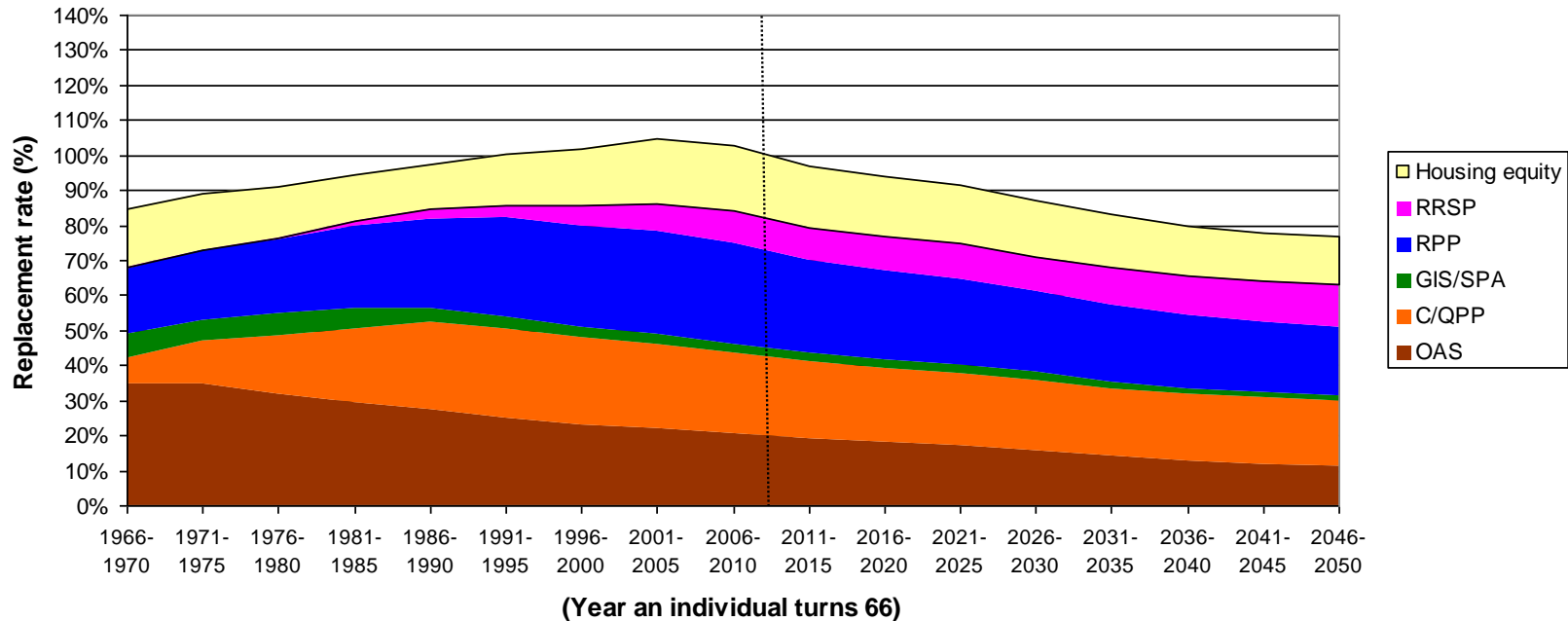


Example: Replacement adequacy of retirement income



Cohort analysis

Stacked average replacement rates
by component and retirement cohort, 1966-2050

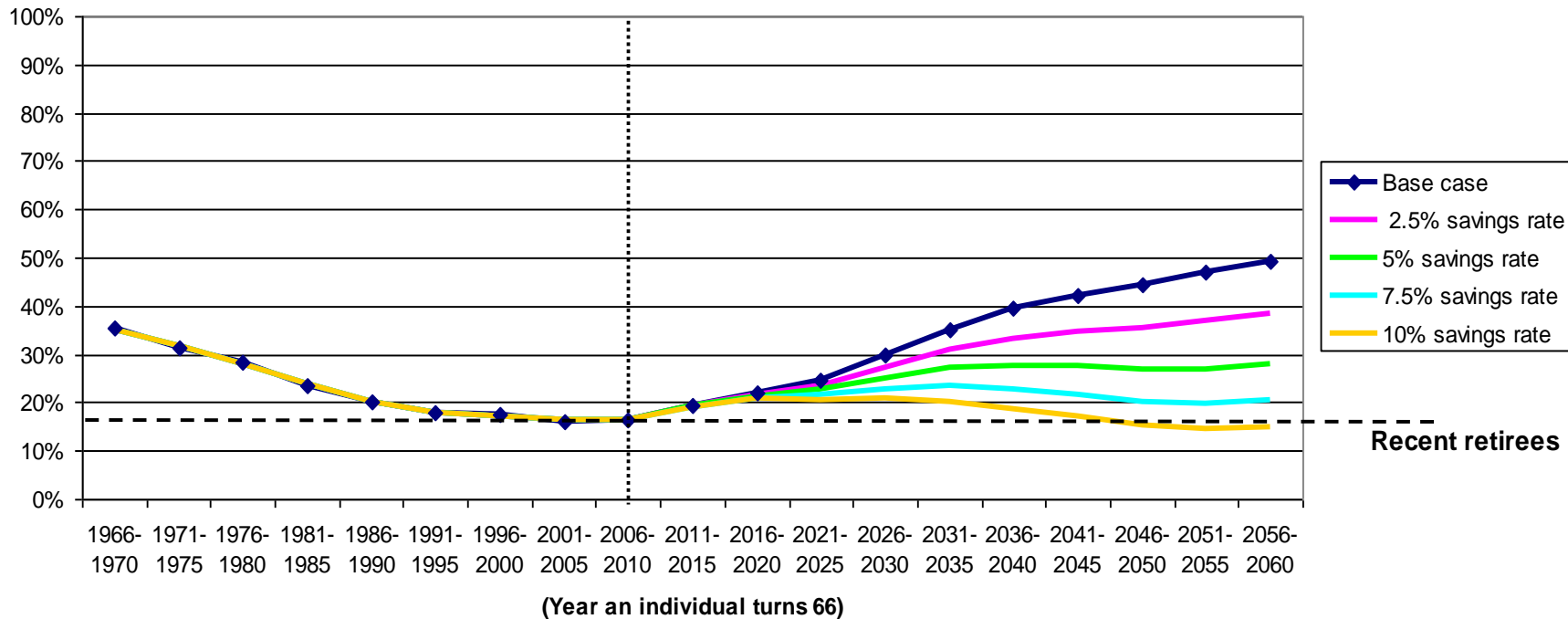


Source: Kevin D. Moore, William Robson, Alexandre Laurin (2010) Canada's Looming Retirement Challenge; C.D. Howe Institute Commentary Pension Papers

Example: Replacement adequacy of retirement income

What-if behavioral analysis

Proportion of individuals with consumption replacement < 75%
by retirement cohort and new savings rate
(Without RPP, 100% part., TER 1.5%)



LifePaths: Benefits & Lessons



- Complex “general purpose” models come at a price, they require strong leadership, a professional “permanent” team and robust funding
- Policy needs ebb and flow; balancing updates and core development with client’s applications is a difficult task.
- Modularity and a technology that allows modellers program their models crucial
- Many spin-offs (which have to be valued)
 - Expertise; “training lab”
 - Readiness: base for new applications
 - Contribution to quality and relevance of data
- Management of complexity (and ambition) difficult; mixed international experience and perception

Conclusions



- There are many reasons for expecting a boom in MS
 - Many policy questions require micro-simulation
 - MS is a logical next step complementing data analysis
 - MS will probably replace many cell-based models: population projection, actuarial models, disease models
 - Technologies like Modgen make MS accessible
- Microsimulation is still under-used and has to find its way into the standard toolbox of social scientists and into classrooms
- Students pick up the ideas and develop skills fast
- Microsimulation has high data demands. Statistical offices are a logical collaborator in microsimulation projects; In return MS can enhance the relevance, quality, and accessibility of data