### Modeling and Simulation of Human Choices: from Utility Theory to Applications

#### **Prof. Michel Bierlaire**

Director – Transportation Center Ecole Polytechnique Fédérale de Lausanne (EPFL) Switzerland





### Introduction : Science Fiction



 Psychohistory: Branch of mathematics which deals with the reactions of human conglomerates to fixed social and economic stimuli. Encyclopedia Galactica, 116th Edition (1020 F.E.)





#### Introduction: Prof. McFadden

- Laureate of The Bank of Sweden Prize in Economic Sciences in Memory of Alfred Nobel 2000
- Owns a farm and vineyard in
   Napa Valley
- "Farm work clears the mind, and the vineyard is a great place to prove theorems"







#### Introduction : marketing



- Prediction of
   market shares
- Choice of brand
- Choice of product features
- Choice of retail store
- Etc.





# Introduction : transportation demand analysis

- Choice of mode
- Choice of path
- Choice of
   destination
- Choice of parking
- Choice of
   departure time









#### Data

#### Model

#### Simulation









#### Data: questionaires



- Data about the respondent
- Choice data
- Revealed
   preferences
- Stated preferences





#### Data: smartphones

- GSM, GPS
- Accelerometer
- WiFi
- Bluetooth
- Ambient sound
- And more...







#### Data: scanner data

- Detailed purchase
   information
- Personalized







### Data: eye tracking



- Where do people look?
- Used in marketing
   research
- Used in driving safety research

Relevant for
 pedestrian models





### Model : assumptions

- Homo economicus
- Rationality
- Utility theory
- Each alternative is
   associated with a utility
- The alternative with the largest utility is chosen







### Model : assumptions



- Strong
   assumptions
- Uncertainty and irrationality must be captured
- Random utility
   models
- Latent variables





#### Model : features

- Disaggregate –
   market segments
- Quantitative and qualitative variables
- Can handle subjectivity attitudesperceptions







# Application : simulation of market shares



### Policy variables (e.g. price) Nonlinear effect





#### Application : market segmentation



Market shares per segment

Granularity
 depends on the
 data availability





# Application : simulation of revenues

- Concept of optimal price
- Can be segment specific







# Application : pedestrian walking behavior



- Choice of the next step
- Collision avoidance
- Leader follower





### Application : pedestrian simulation







#### **Application : pedestrian simulation**







### **Applications: route choice**

- Complex problem
- Number of paths is
   huge
- High level of
   overlapping
- Shortest path not behaviorally meaningful







#### **Application : electric vehicles**



- Market shares
- Hypothetical choice
- Importance of attitude toward the environment





# Application : facial expression recognition

- Automatic identification of the emotion
- Potentially
   different across
   cultures
- Requires advanced image processing algorithms







# Application : demand-supply interactions



- Revenue
   management
- Market equilibrium

Combination of operations research and demand models





### Conclusion

- Discrete choice models
- Advanced and operational
- Accomodate modern data sources
- Wide range of applications
- Complex models requires simulation tools





Short course : Discrete Choice Analysis: Predicting Demand and Market Shares

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- Prof. Ben-Akiva (MIT) Prof. Bierlaire (EPFL)
- transp-or.epfl.ch/dca





