



**Lancaster University**  
MANAGEMENT SCHOOL

# *Understanding Consumer Behaviour in Information and Communication Technologies (ICTs)*

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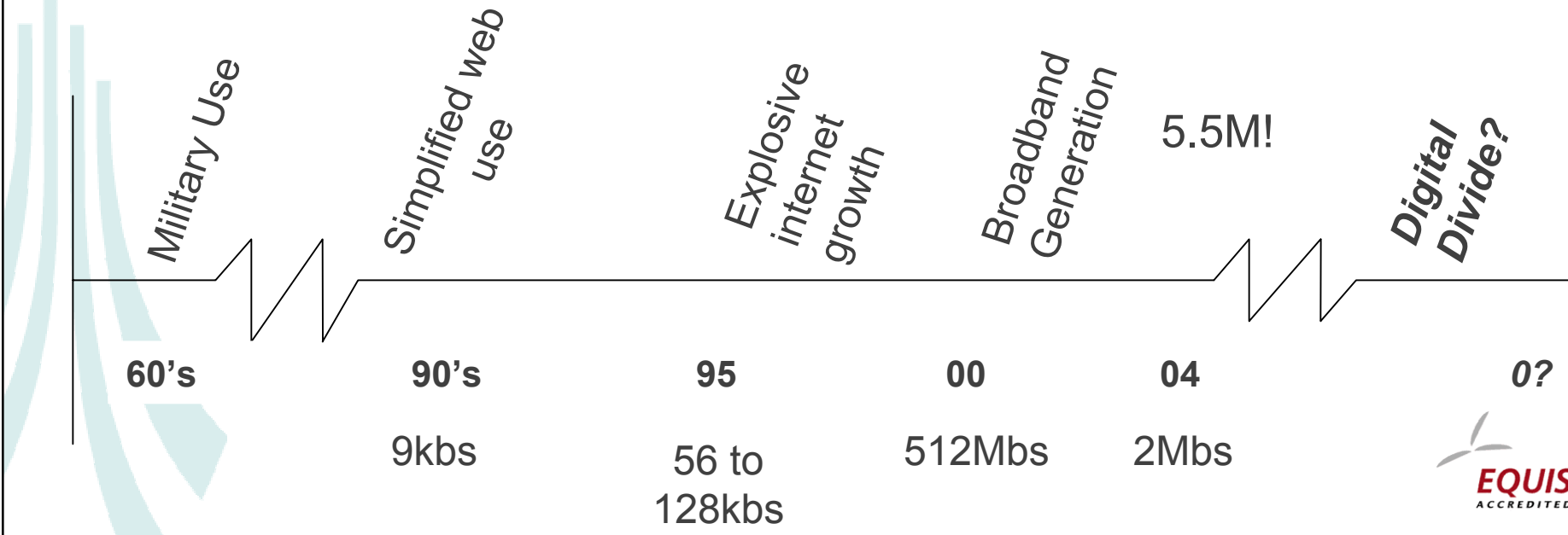
United Kingdom





# What are ICTs?

- ICTs are 'gadgets' that people can use to connect to information and to communicate with one another.
  - e.g. Computers and PDA's.
  - Focus here is limited to internet adoption.
- *But why has research into ICT adoption become so important?*





## Discussion highlights a fast changing market

- *What do market stakeholders need to know to be able to forecast the market better?*
  - Why and Which consumers adopt technologies!

Knowledge of consumer behaviour

Development of new methodologies, or existing techniques re-applied

How to apply this information to produce forecasts



## The stakeholder positions

- *Digital divide highlights missed revenue or missed development opportunities and cost saving.*

– Marketers and Business Planners;

- ***Missed revenue:*** Untapped market

– Government and Regulators;

- ***Missed development opportunities:*** Countries with less ICT *may* grow less.

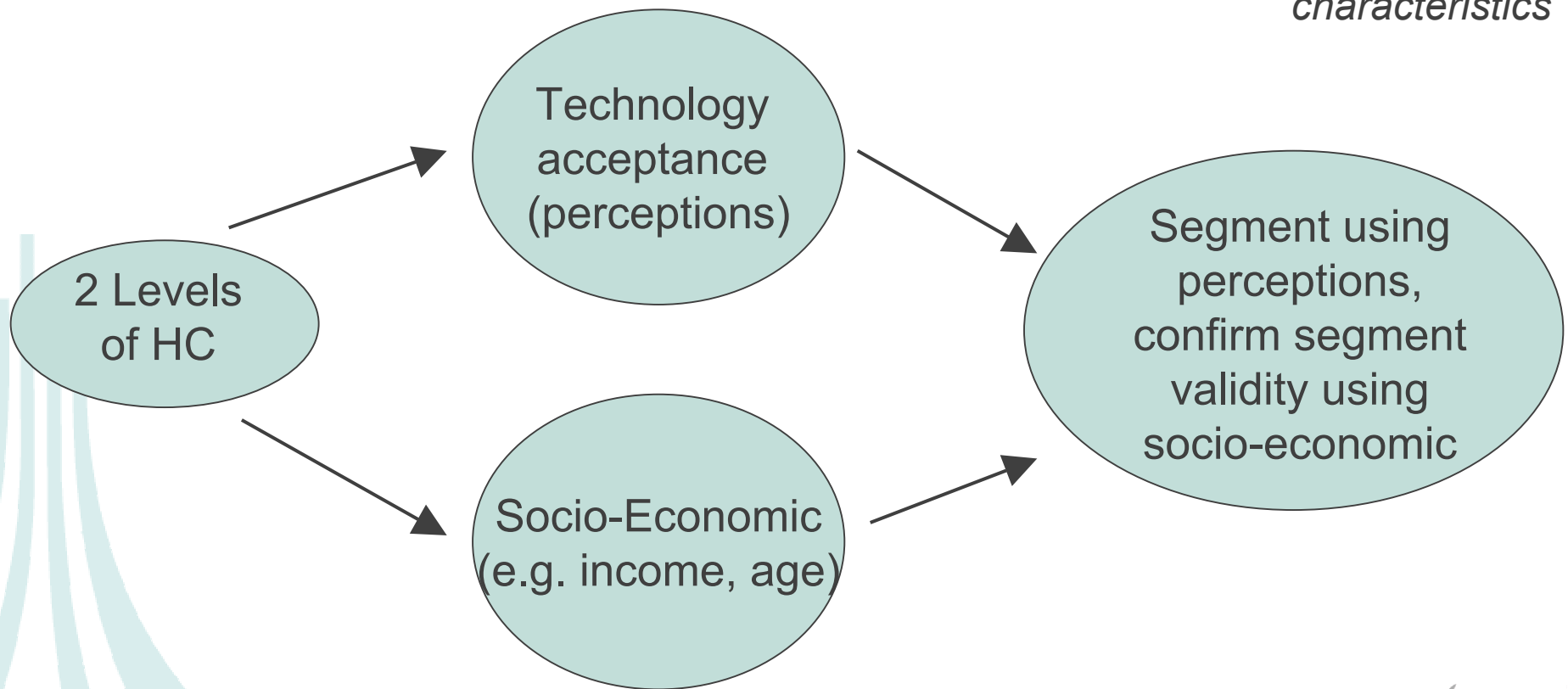
- ***Missed cost saving:*** Those on ‘wrong’ side of divide use government services more frequently.



## Focus of the Research

- *Human characteristics and ICT*

*Combine to produce consumer groups with unique ICT characteristics*





# Application of Human Characteristics

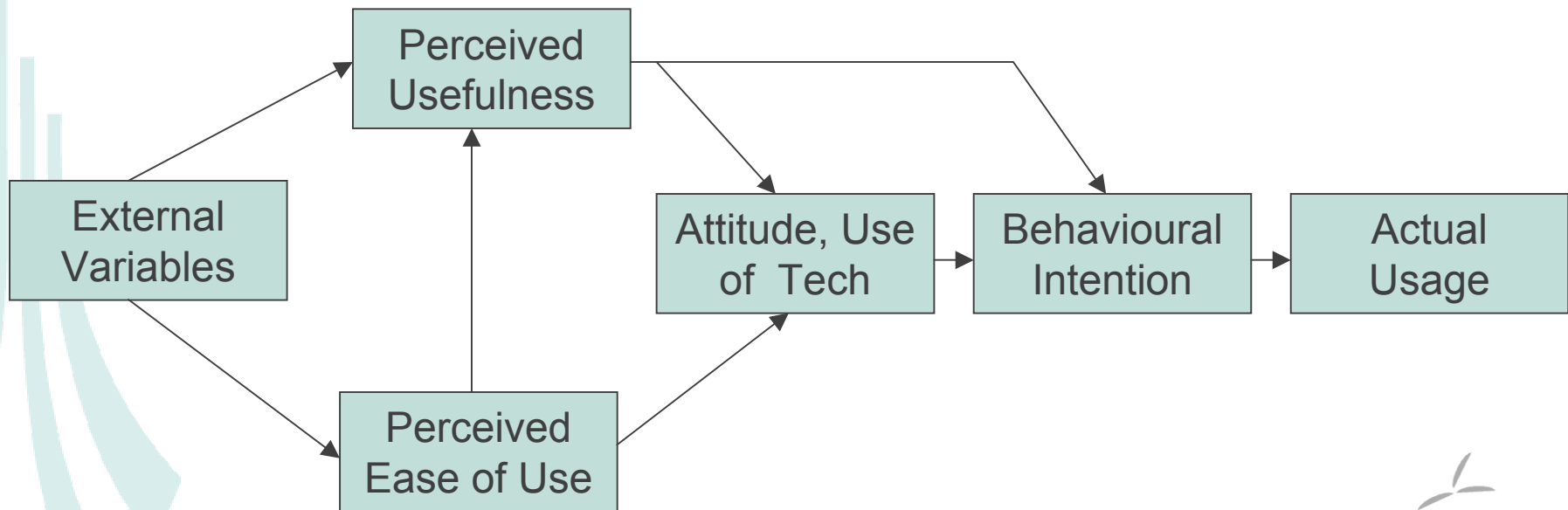
- Segmentation;
  - measure of the digital divide?
- Model estimation;
  - Application of choice modelling.
  - confirmation of what drives the digital divide.
- Experimentally, applied to the diffusion modelling process;
  - Introduces idea that that segmental diffusion curves can be estimated.
  - Estimate of how digital divide may evolve over time.



# Social Psychological Factors

- *Massive literature on TAM;*
  - Google ‘technology acceptance model’
  - A large number of test applications.

Fred Davis (1989);





- Adams (1992): Usefulness and Ease of Use perceptions
  - Applicable to diagnosis of user acceptance in technologies in general
  - Especially applicable when adoption is voluntary
- Igarria et al (1996): TAM research justified due to extensive expansion into ICTs by businesses, but low final use
  - Similar to residential ICT adoption?



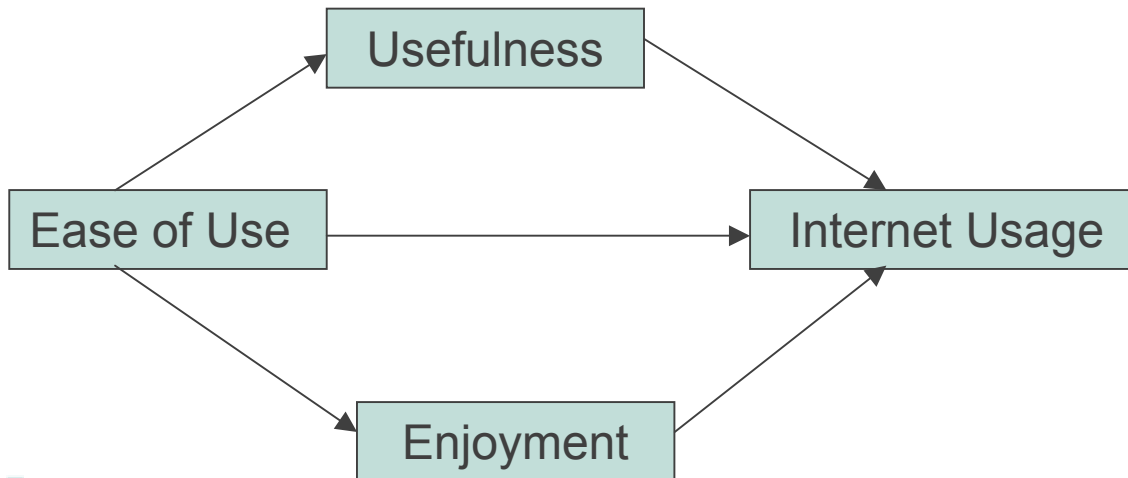


## Enjoyment and ICT adoption

- *An obvious point,*
  - If computers become more enjoyable to use, their adoption and usage will increase, Igbaria (1996)
  - Perceived enjoyment distinct from U and EoU
  - Three perceptions are measurable at the consumer level
    - EoU, U and E



# First internet test of TAM, Teo (1999)



*All perceptions important, but usefulness more so....*

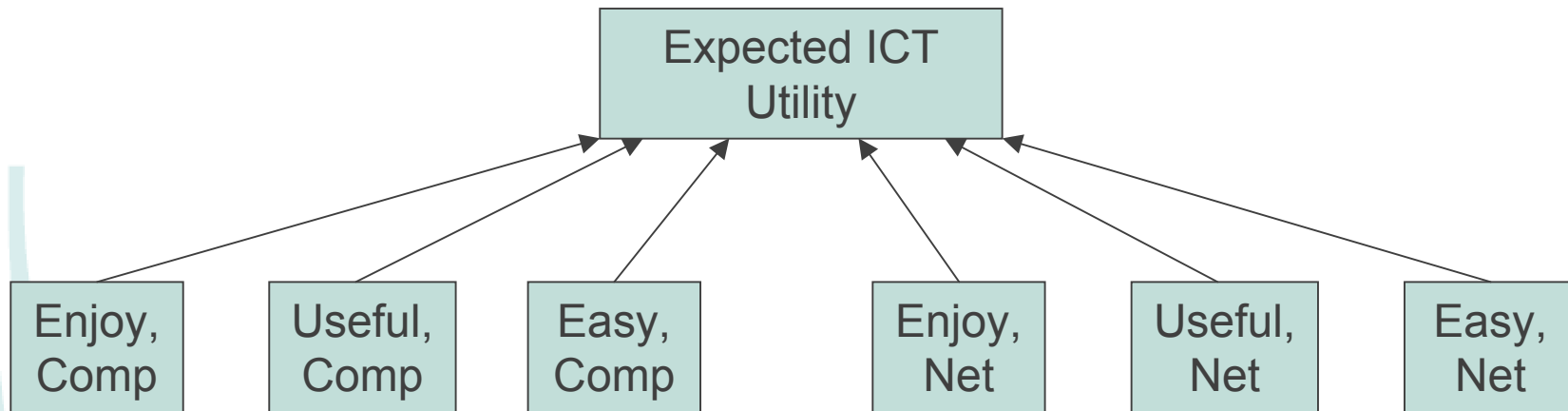
- *Where next?*

– New application of the TAM perceptions...



# An application of TAM, Survey of UK Households

- Extensive data collected from 1286 HHs.
- Data was weighted to minimise non-response bias.





## Simple Application of Expected ICT Utility

Divide up the measure into arbitrary segments.



Merge 'similar' segments i.e. if demographically similar.



Measure known characteristics for each segment.

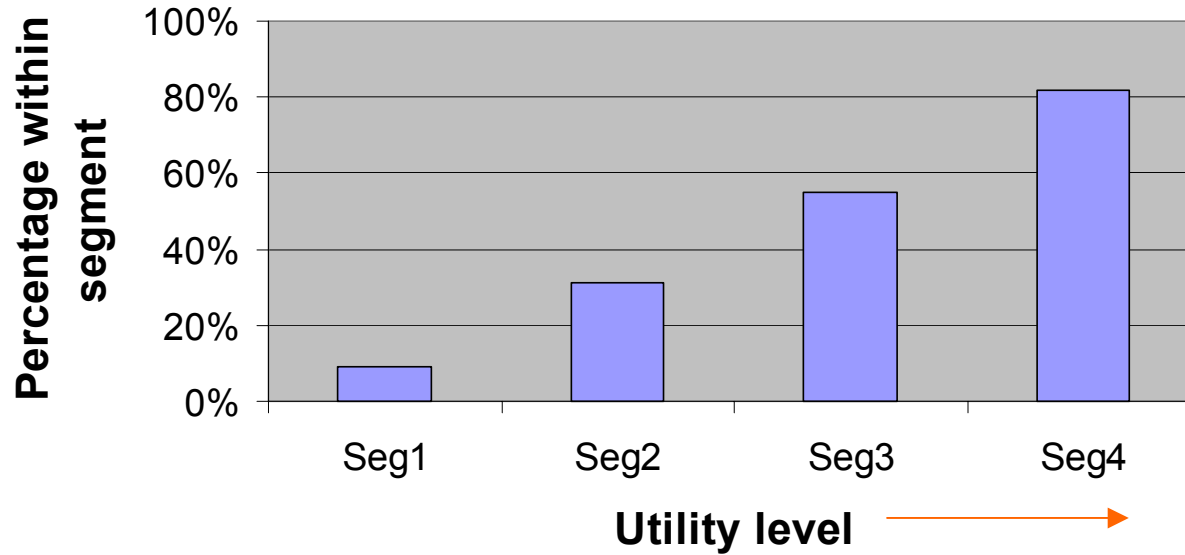


For each segment, measure their proportion in the data;

*This is an estimate of the proportion of consumers in the UK of this utility level.*

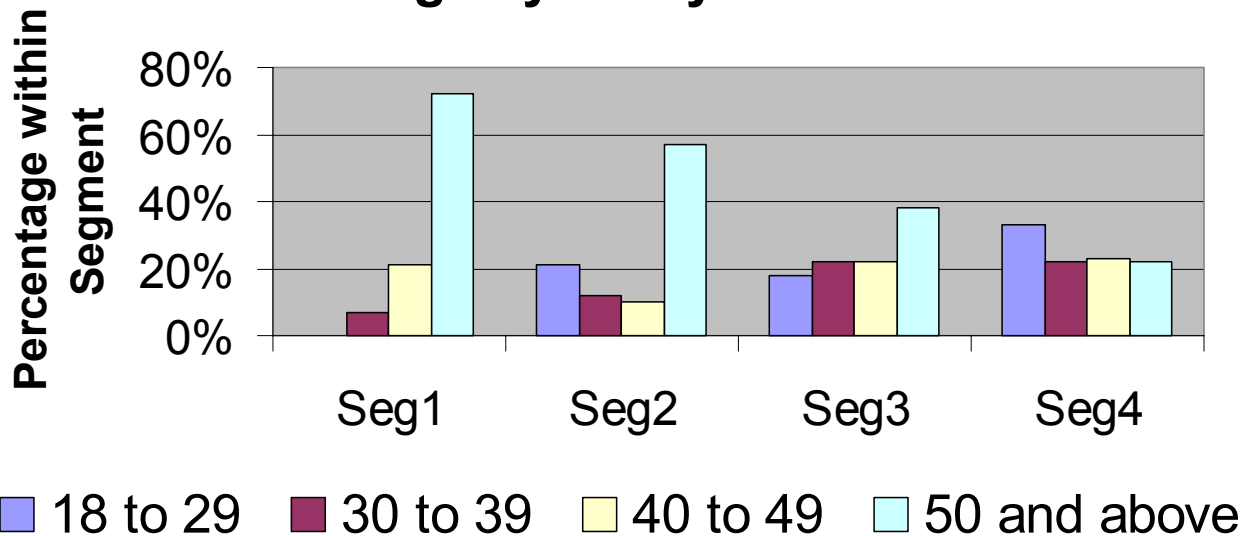


## Computer Adoption by Utility Level



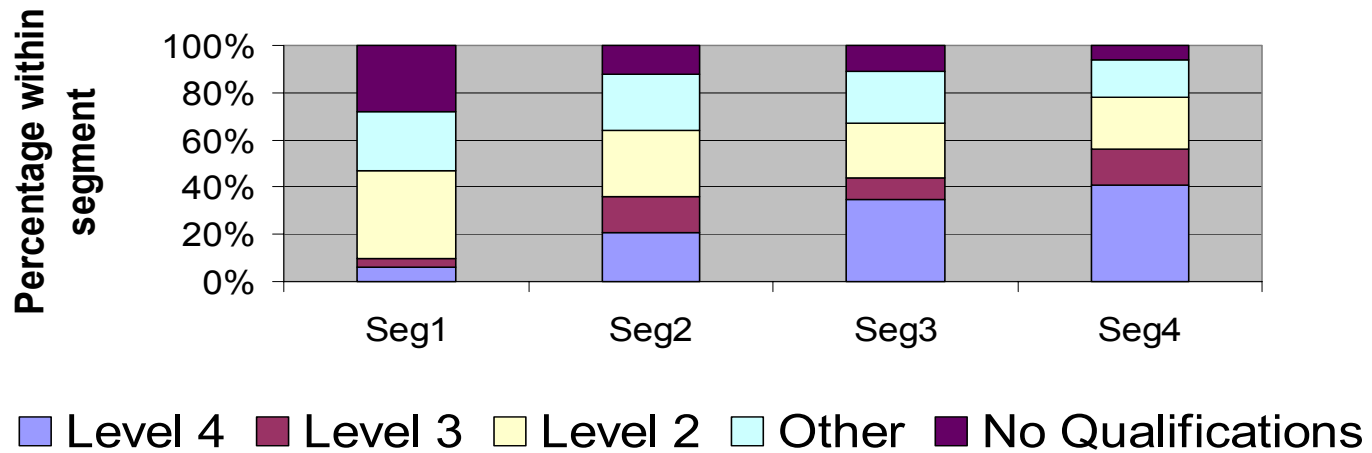
NB: No difference in gender...

## Age by Utility Level

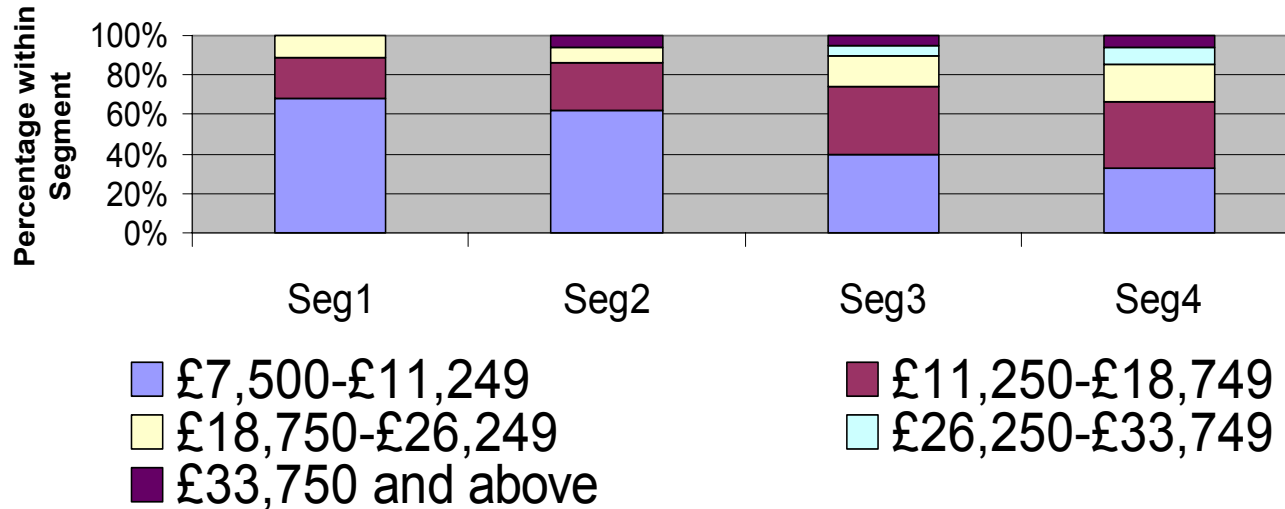




## Educational Attainment by Utility Level



## Individual Disposable Income by Utility Level





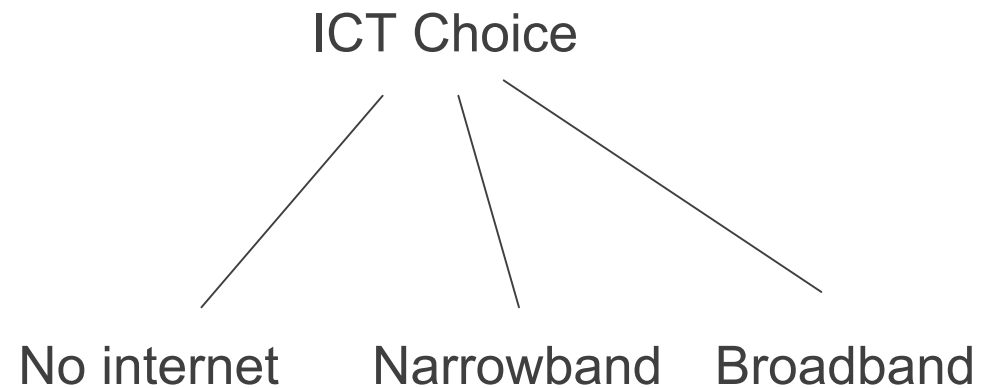
- **Complex approach**

- Incorporate expected ICT Utility with other strategies

→ *Stage 1, fairly common procedure*

- *Estimate consumer choice model*
  - *e.g. logit*

Factors drive  
the choices...



- *Use the model to define segments via expected ICT utility*
  - *Estimate segmental price sensitivities*



## How is logit output interpreted?

Logit estimates ICT adoption probabilities given a set of inputs, much like regression;

$$\Pr_i(j) = \frac{\exp(\beta_1 x_{i1} + \beta_2 x_{i2} + \dots + \beta_k x_{ik})}{\sum_{j=1}^n \exp(\beta_1 x_{i1} + \beta_2 x_{i2} + \dots + \beta_k x_{ik})}$$

Factor effects  
facing  
consumer  $\beta$

Factor effects  
facing  
consumer  $x_i$

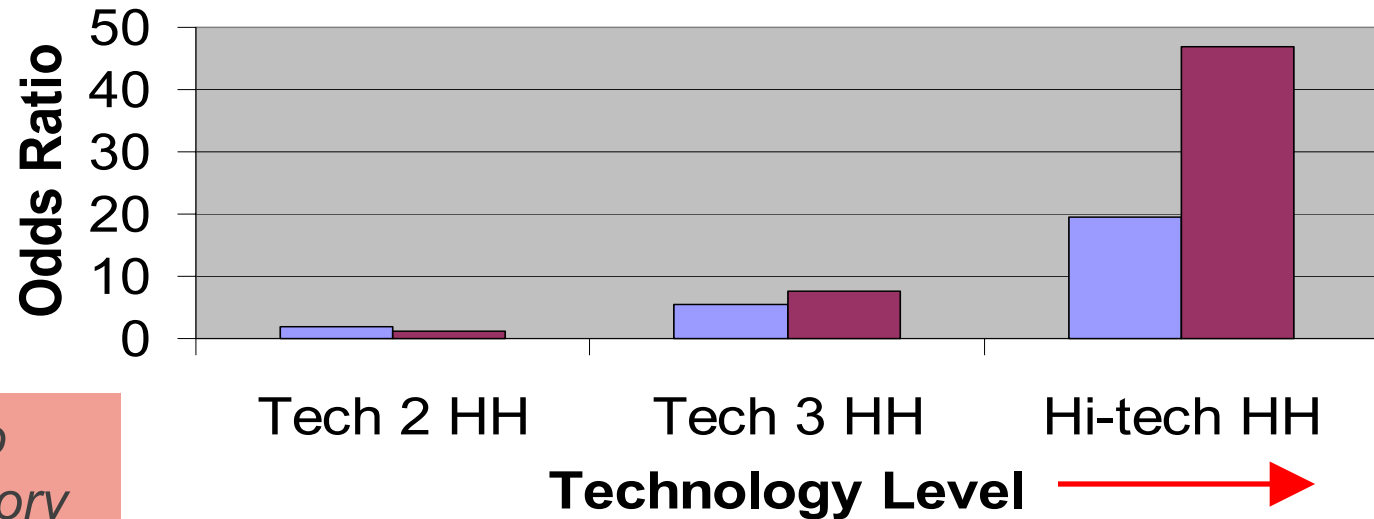
Where  $\Pr_i(j)$  =  
Probability  
individual  $i$   
purchases  
product  $j$  given  $x_s$





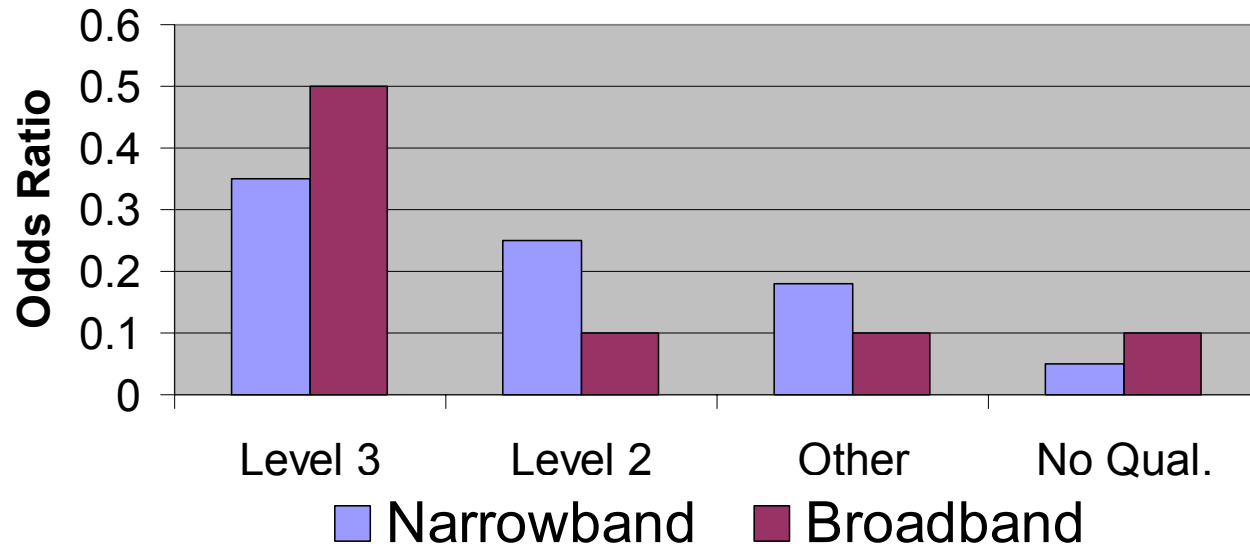
# Technology Levels in the Home

■ Narrowband ■ Broadband



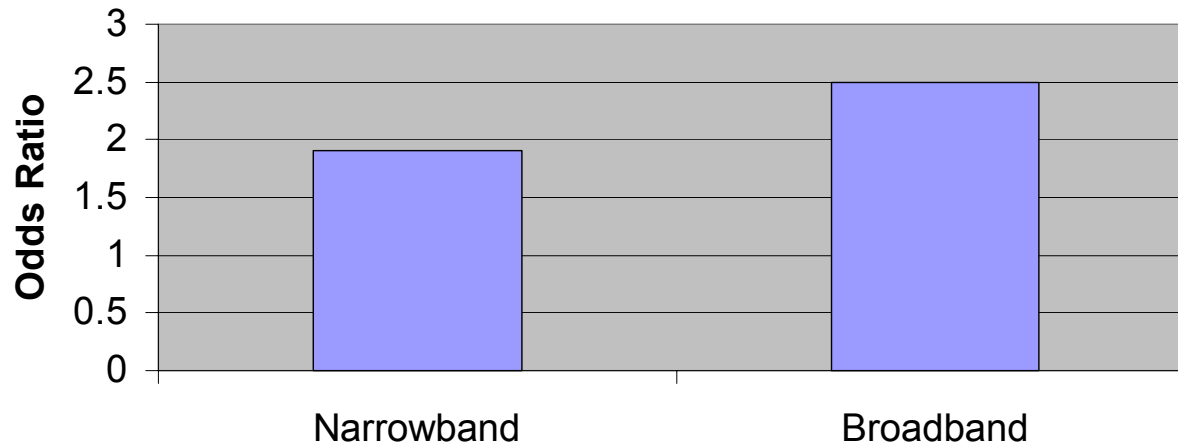
Compare to missing category

## Household Educational Attainment





## Presence of Children



Internet Choice Elasticity: +0.2

**Point:** Overall effects stronger for broadband than for narrowband



**Insight:** Demographic effects dissipate over time...



# Segmentation Results

Table 2: ICT utility segments

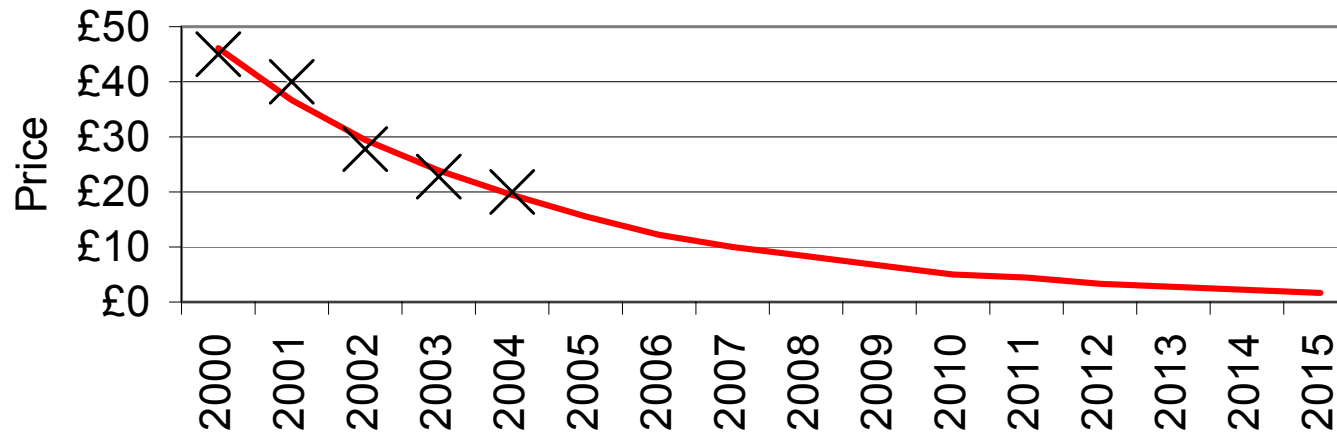
ICT Utility Level	Household Description	Broadband Price Elasticity	Computer Adoption
Low (2.2%)	Low income and educ., retired, unemployed.	-1.77	8%
Low to Mid (13%)	Moderately better income, slightly better educ. Blue collar.	-1.51	21%
Mid to High (22.7%)	Good income and educ., white collar, possibly kids.	-1.42	65%
High (62.1%)	High income and educ., 25% with kids, love technology.	-1.28	83%



→ *Stage 2, new and experimental procedure*

- *Apply price forecast to the model for each segment*

Broadband Price Forecast



× Broadband Price      — Forecast

$$P_t = \exp(4.04 - 0.22t)$$

*Work resulting segmental adoption probabilities to the diffusion process.*

Segmental Adoption Probability

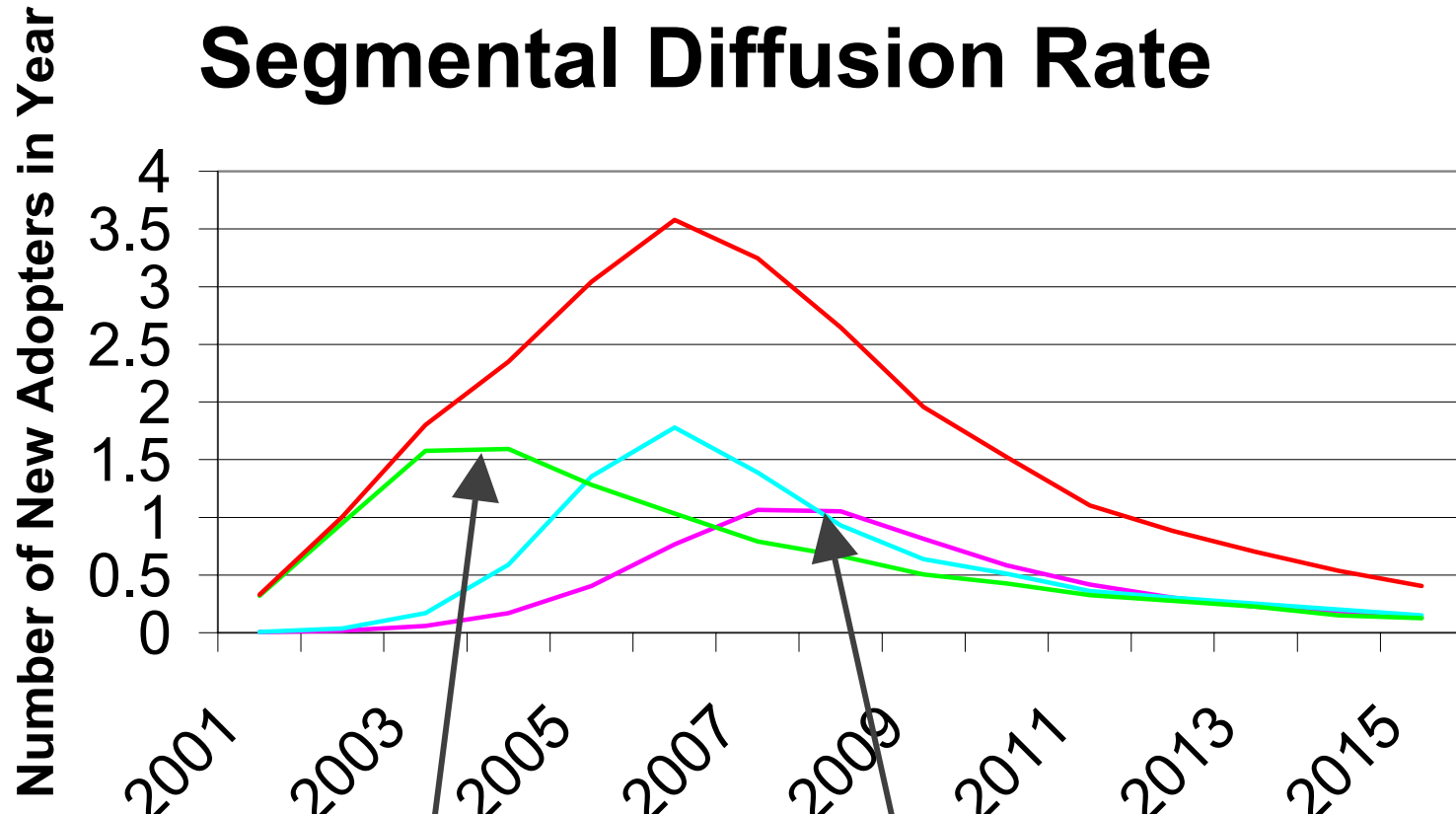
$$N_s(t) = \underbrace{M \text{Prob}(s|Pr)_t}_{\text{'Moving' Social System Size N}} \left[ \frac{1 - e^{-(p_s + q_s).t}}{1 + \frac{q_s}{p_s} e^{-(p_s + q_s).t}} \right]$$

'Moving' Social System Size N

Segmental Innovation and Imitation Parameters



# Segmental Diffusion Rate



— Low to Medium Utility  
— High Utility

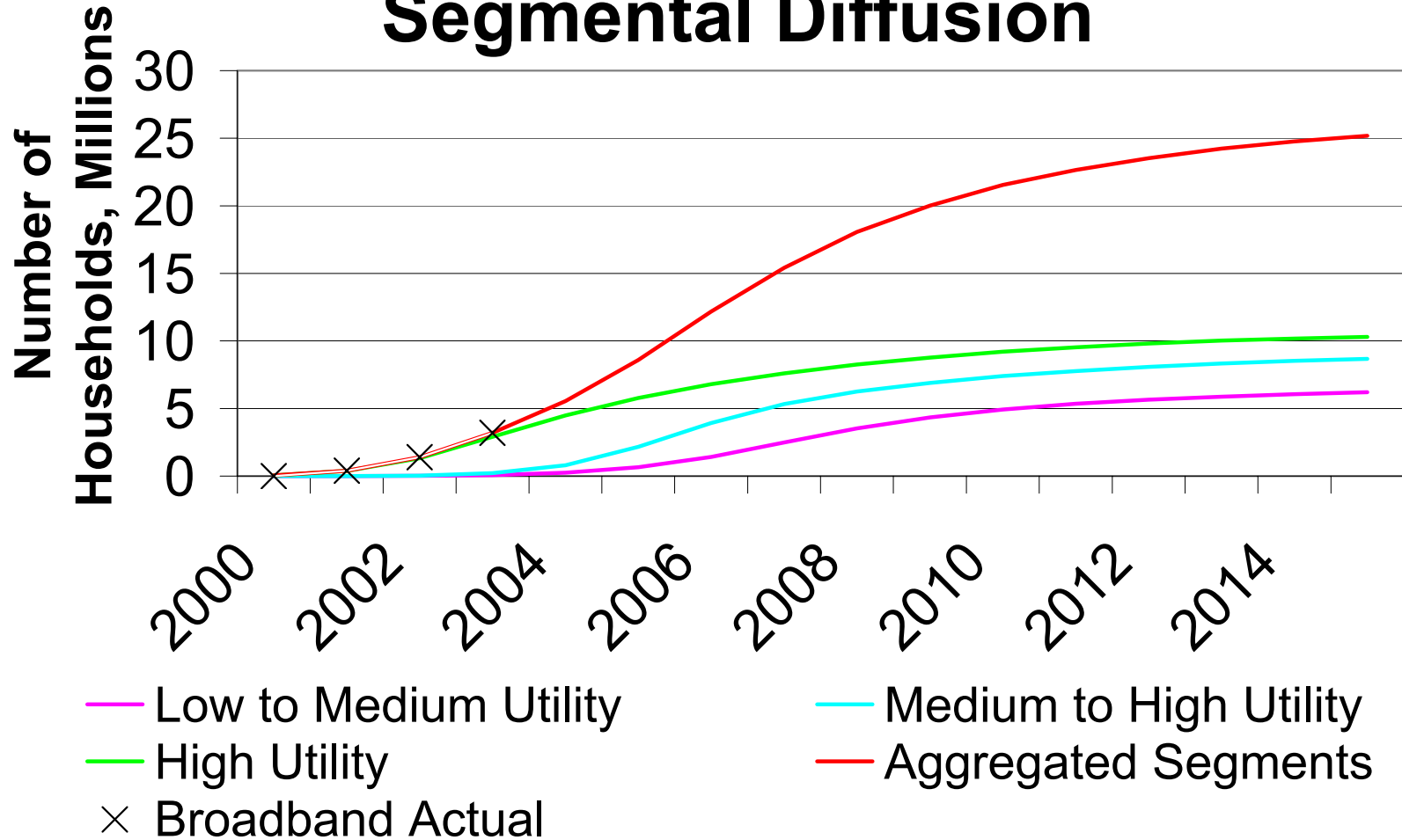
— Medium to High Utility  
— Aggregated Segments

High Utility  
Adopt First:  
*Innovators*

Low Utility are  
the *Laggards*

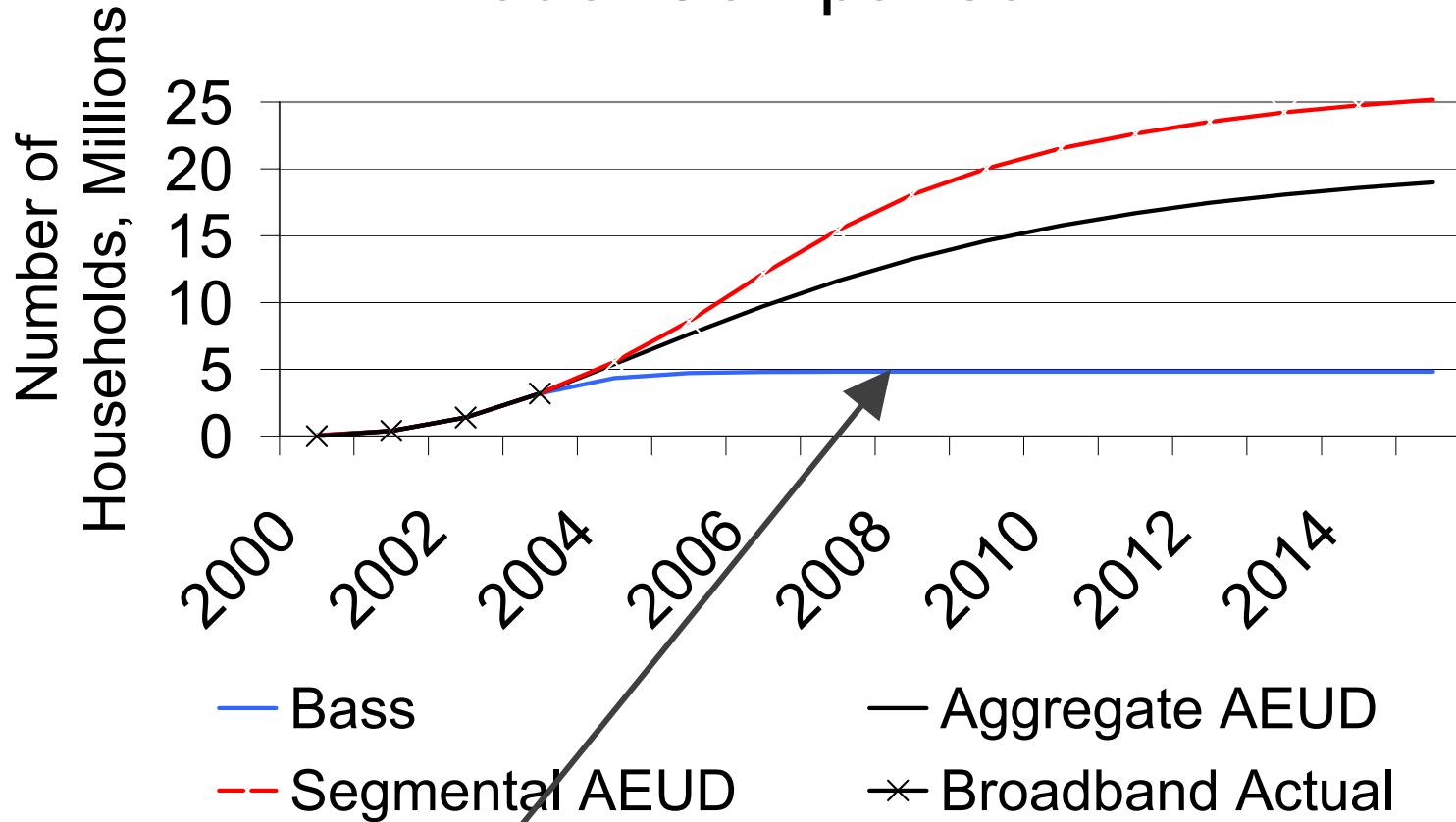


# Segmental Diffusion





# Model Comparison

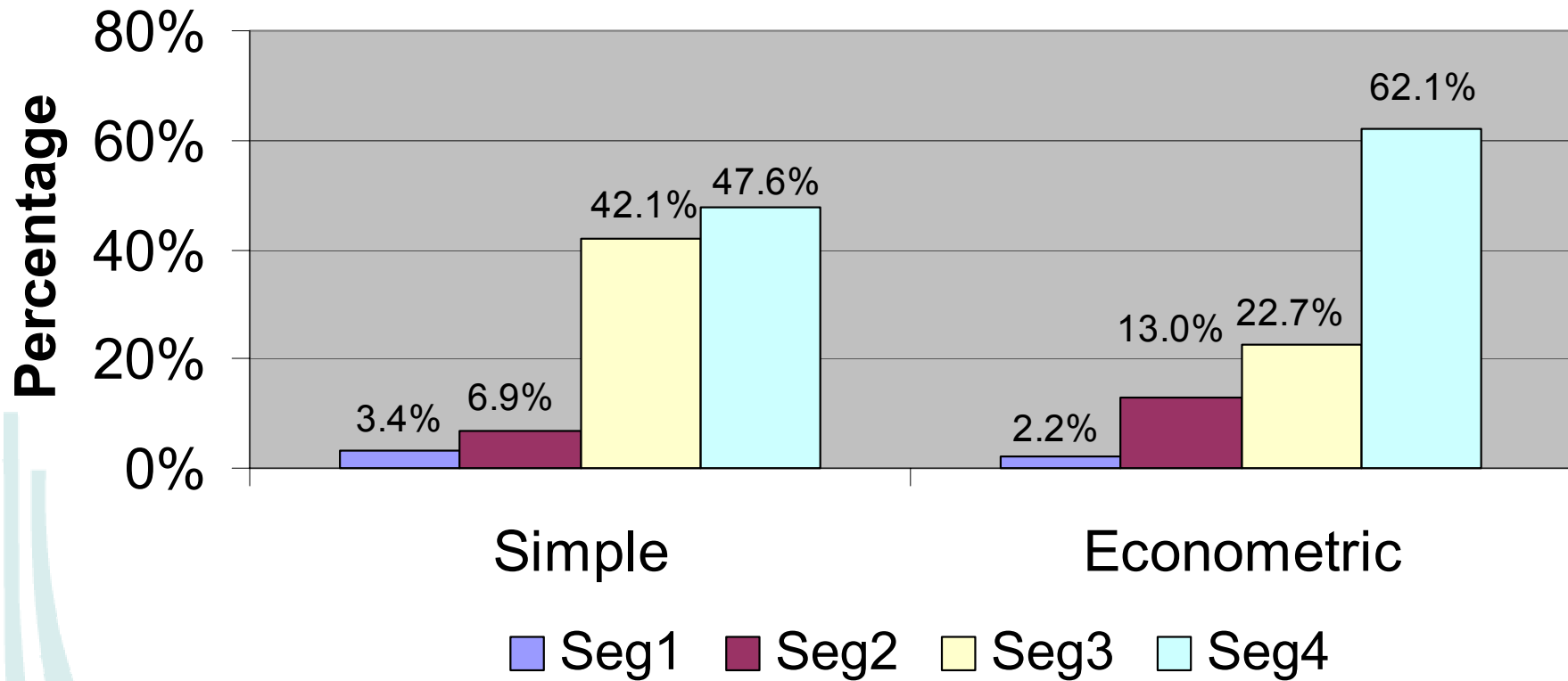


Bass tends to under perform in presence of limited data





## Segmentation approaches: *Simple versus Econometric*



***Which to choose?***



## Recap.

- The presentation has introduced expected ICT utility as a segmentation variable for residential ICTs;
  - Created from a sound theoretical foundation.
  - Applications go some way to confirm validity of the measure.



# Issues

- More testing needed to confirm validity;
  - New survey is proposed for next year.
  - Same HHs, two year interval.
  - Track segmental shifts.
- Wider tests required;
  - Different applications (e.g. wireless apps.).
  - Different countries.



# Future Possibilities

- Other applications may exist for this variable also, especially if captured regularly in time;
  - Comparable measures across countries.

$$\text{Expected ICT Utility}_{it} = f(\text{Socio-economic factors, regulatory framework})_{it}$$

*Where  $i$  could be individual or country...*