

# Energy Decision-Making for Cities

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UKERC

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University of Oxford

# Future energy decision making for cities:

*Can complexity science rise to the challenge?*

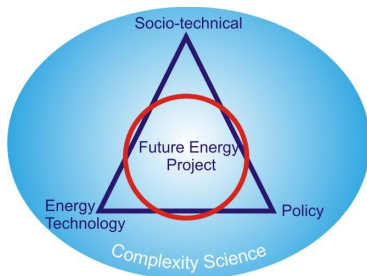
- Using complex systems methods to understand energy decision-making at the city level

## 1. Network modelling

- consumer behaviour models<sup>1</sup>,

## 2. Agent-based simulation

- Modelling electricity consumption in office buildings<sup>2</sup>

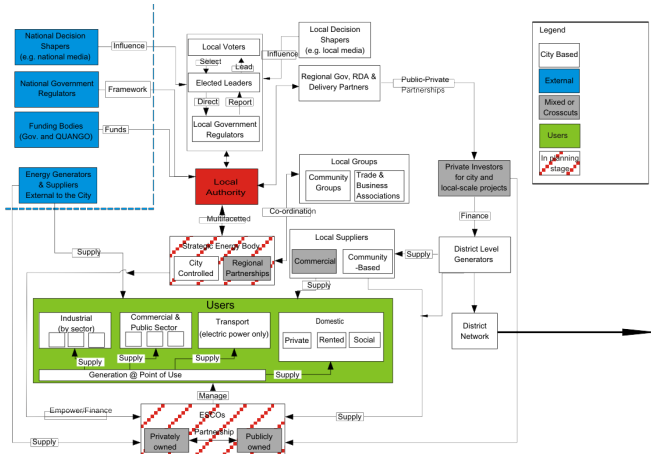


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1: McCullen *et al.*, IJBC (2011)

2: Zhang *et al.*, Energy and Buildings (2011)

# Background: local authority energy planning



- Local authorities (LAs) are willing to think strategically about energy interventions but need the tools to do so.

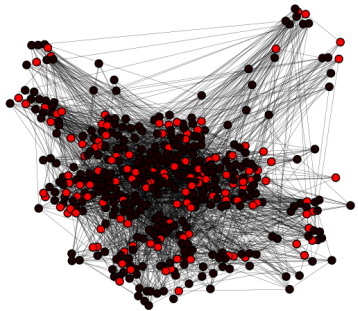
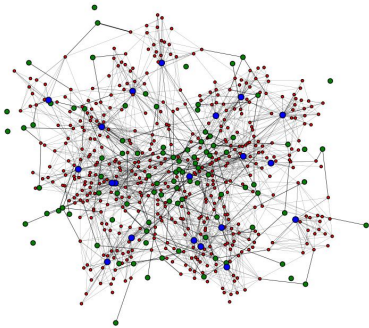
*Network models:  
Role of social networks in  
domestic sector uptake of  
energy-efficiency innovations*

N. J. McCullen.



# *Role of social networks in domestic sector uptake of energy-efficiency innovations*

- influence of social networks not previously considered.



- We use complex networks to model innovation diffusion mediated via social network interactions.



# Modelling adoption of innovations

**Households** are *nodes*.

*Links* represent **interactions**.

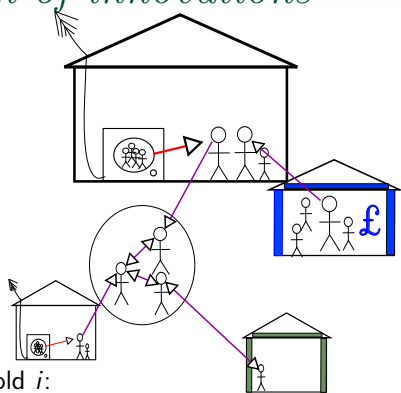
- Households adopt based on various factors:

- personal + social benefit<sup>a</sup>.
- Intrinsic benefits to household.
- Social benefit combination of both<sup>b</sup>:
  - personal social network,
  - mainstream social norm.

- Total *utility* to individual household  $i$ :

$$u_i = \alpha_i p_i + \beta_i s_i + \gamma_i m \quad (1)$$

- $p_i, s_i, m$ : personal, peer-group and societal influence.
- $\alpha_i, \beta_i, \gamma_i$ : relative weightings given to each factor.
- Adoption occurs if  $u_i$  exceeds a *threshold*  $\theta_i$ .



<sup>a</sup>Delre *et al.* (2010); <sup>b</sup>Valente (1996)

(1) from: McCullen *et al.*, in prep. for SIADS, (2012)



## Parametrising the models using survey data

- Survey data including info on behaviours.
  - Over 1050 valid responses received from residents of Leeds.
- Data used as a guide rather than definitive source,
  - used to narrow choice of structure and parameter values,
  - also to illustrate potential applications.

Model element	Parameter	Question / Data
Network	number of active individual / group connections.	Q. on who talks to whom about energy.
Threshold	$\theta$	Q. on house type, tenancy and income.
Node archetypes	$\alpha, \beta, \gamma$	Defra types of pro-enviro. behaviour



## Modelling Scenarios

- Different **scenarios** studied by varying *dynamical model* and *network parameters*.

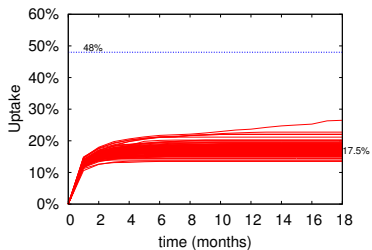
	Baseline	Seeded	Community	Incentives	Snowball
Model Param.	Do Nothing	Give efficiency measure to some (random) individuals	Give efficiency measure to whole communities.	Advertise a money off scheme.	Recommend-a-friend discount voucher scheme.
Links	Data based	–	–	–	<b>Increase</b>
Threshold	Data based	–	–	<b>Lower</b>	<b>Lower</b>
Initial Seed	Unforced	<b>Random</b>	<b>Target</b>	–	–



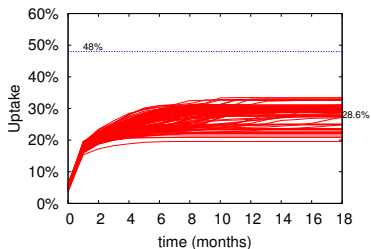


# Example model results

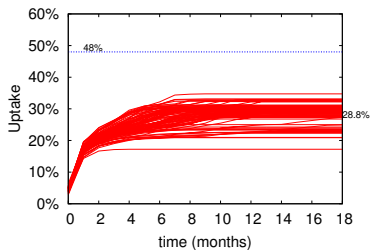
## Baseline



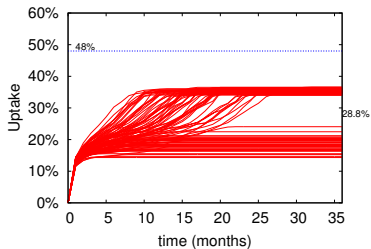
## Seeded



## Community

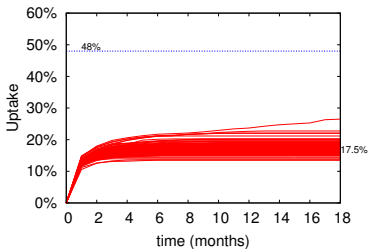


## Incentives

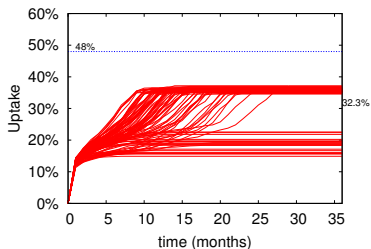


# Example model results

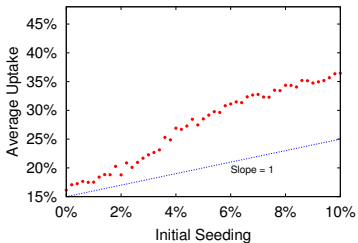
## Baseline



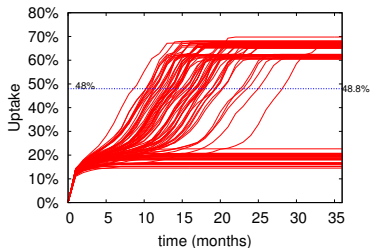
## Snowball



## Seeding Level



## Snowball + Extra



*Agent Based Simulation:  
Role of user learning in council-led  
smart meter deployment*

T. Zhang

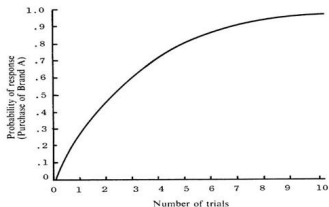
University of Nottingham

## *Role of user learning in council-led smart meter deployment*

- Smart metering is one of the key interventions that local authority can take to manage and control the energy consumption in Leeds.
- Deploying smart meters to council-owned properties is a type of authoritative technology adoption.
- User learning (i.e. transit from zero knowledge about smart meters to making the best use of them) is very important in this process.

# Theoretical Basis<sup>1</sup>

- Technology adoption decisions:
  - Optional Innovation-Decision
  - Collective Innovation-Decision
  - Authority Innovation-Decision
- User learning



The form of the function is

$$P_A = M(1 - e^{-kt}), \text{ where:}$$

$P_A$  is the probability of purchasing **Brand A**,

$M$  is the maximum attainable loyalty to **Brand A**,

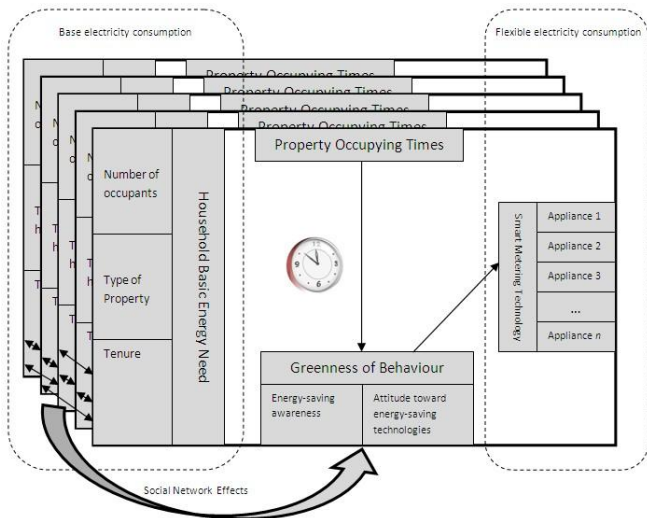
$k$  is a constant expressing the learning rate,

$t$  is the number of reinforced trials

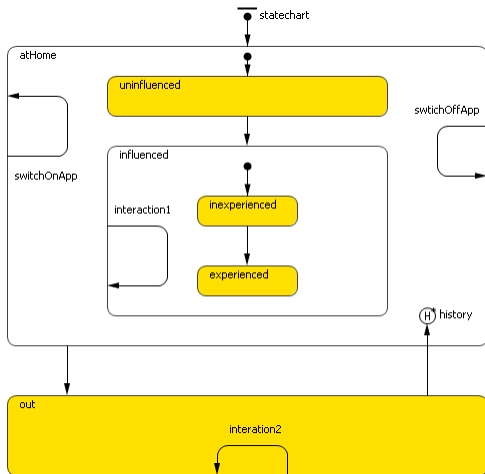
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<sup>1</sup>Bennett and Mandell (1969)

# Overview of the ABS model



## Behaviour of Residential Energy Consumer Agents

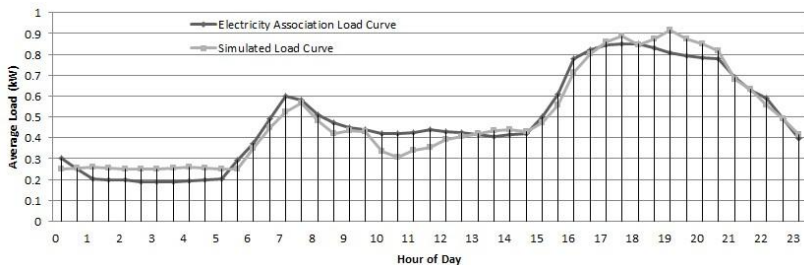


- Empirical data for the simulation model from Leeds survey.
- Developed archetypes of residential energy consumers<sup>2</sup>.

<sup>2</sup>Zhang *et al.*, 2012

# Simulation Experiments

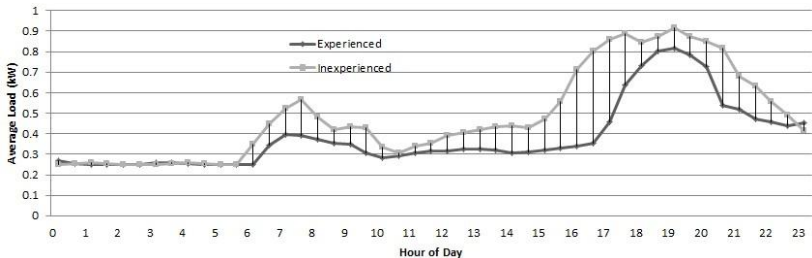
- Simulated Load Curve vs. Real Load Curve:





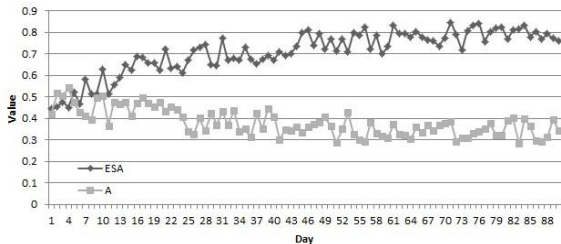
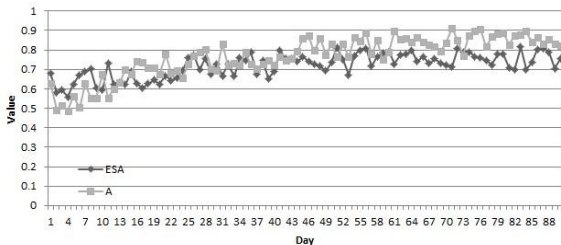
# Simulation Experiments

- The effect of smart metering



# Simulation Experiments

- Continuers vs. Discontinuers



## *Insights and lessons learned*

- Developed complexity science models of city level domestic energy users:
  - network and ABS models of different aspects,
  - populated with data from real-world.
- Network models comparative rather than predictive.
  - social network interactions are important,
  - trust in various sources of information matters.
- ABS can produce simulation results to reflect real-world,
  - use to predict future effect of smart metering,
  - can look at possible effect of discontinuers.
- Complex systems models could be used for aiding policy decisions.

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