

# Modelling urban energy systems

## Approaches, challenges and opportunities

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## Outline

- What is an urban energy system?
- Approaches: State of the literature in UES modelling
- Challenges: data, model complexity and integration, policy relevance
- Opportunities: techniques, theory and implementation
- Conclusion

## Introduction

What is an urban energy system?

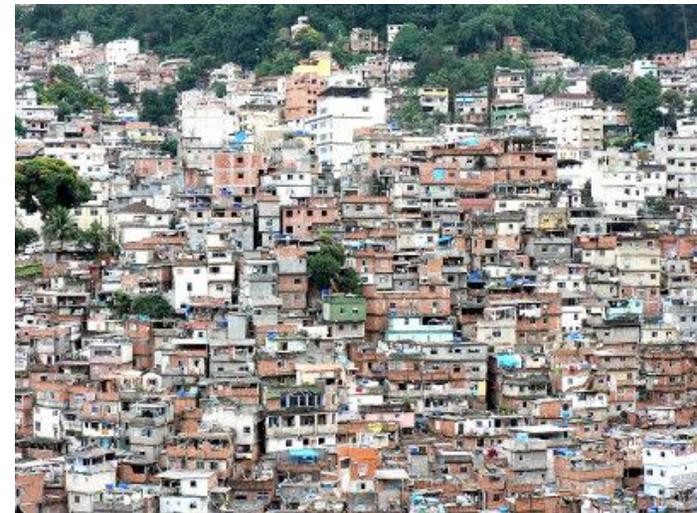
- “*the **combined processes of acquiring and using** energy to satisfy the energy **service demands** of a **given urban area**” after Jaccard (2005)*
- Cities account for 2/3 global primary energy demand, 71% energy-related GHG emissions (IEA, 2008)

Key elements

- Land use and activity location
- Use patterns (human behaviour)
- Built environment (transport and buildings)
- Supply technologies and fuels

Drivers of coming urban energy transitions

- Increased urbanization in developing countries
- Aging infrastructure in developed countries
- Carbon, energy security imperatives
- New technologies at local and grid levels



Source: World Resource Institute on  
Flickr

## Approaches to UES modelling

- 6 approaches identified by a recent review\*
  - Technology design
  - Building design
  - Urban climate and energy use
  - System design
  - Policy assessment
  - Transport and land use
- Each has its own methods, motivations, pros and cons
  - Growing interest in integrated modelling

## Approaches: technology design

Typical features:

- Small spatial scale
- Monthly temporal scale
- Simulation methods
- Supply-side focus

Range of technologies including:

- Transport, heat/cooling equipment, solar energy, ducted wind turbines in urban areas



Source: Grant et al (2008)

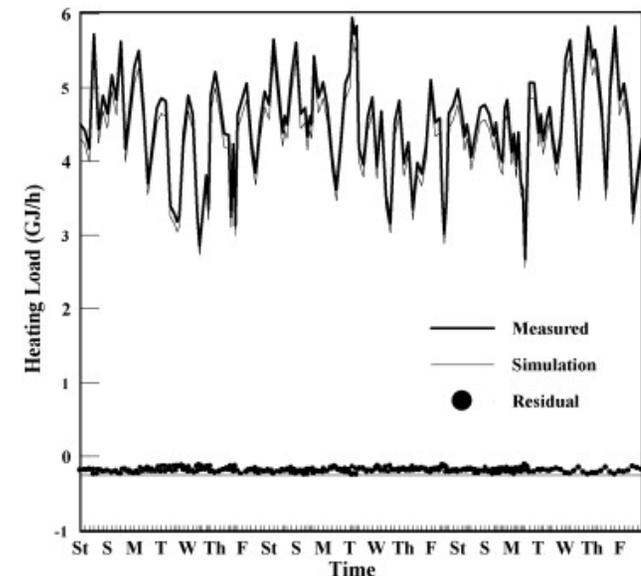
## Approaches: building design

Typical features:

- Building spatial scale
- Annual temporal scale
- Simulation methods
- Demand-side focus

Examines design of building types

- e.g. Eskin et al (2008) on heating and cooling of offices
- Both new build and retrofit

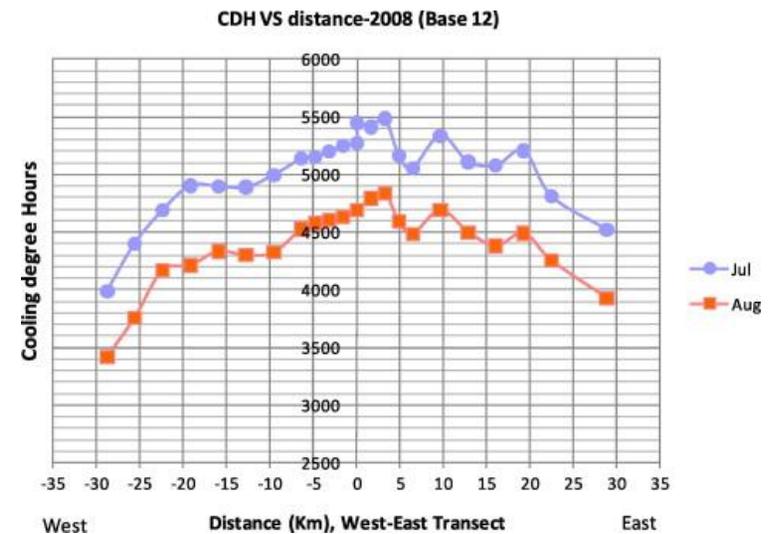


Source: Eskin and Turkmen (2008)

## Approaches: urban climate and energy use

Typical features:

- Neighbourhood/street spatial scale
- Hourly temporal scale
- Simulation methods
- Indirect demand-side focus



Source: Kolokotroni et al (2010)

Drivers but not demands

- e.g. temperature, lighting, ventilation, not kWh
- Counter-example: Mavrogianni et al (2011) on urban heat island and impact on energy consumption

## Approaches: system design

Typical features:

- District spatial scale
- Static (or annual) temporal scale
- Optimization methods
- Exogenous demands, endogenous supply

Typical use case:

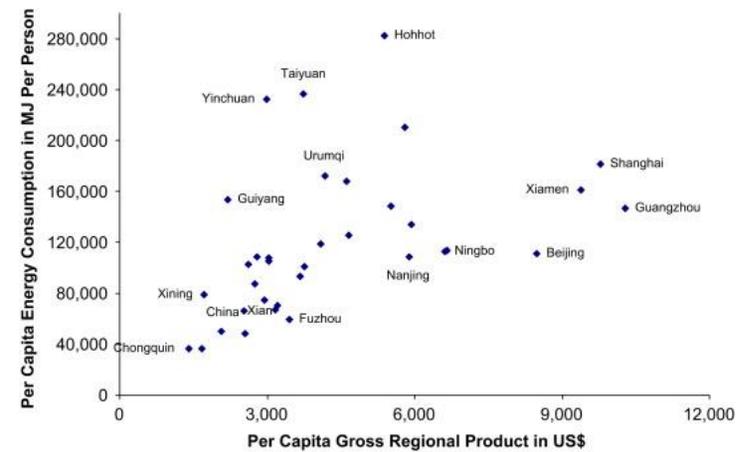
- For a defined mix of energy service demands, what is the lowest cost energy supply system that meets a carbon constraint?



## Approaches: policy assessment

Typical features:

- City spatial scale
- Static temporal scale
- Empirical methods
- Exogenous supply and demand



Source: Dhakal (2009)

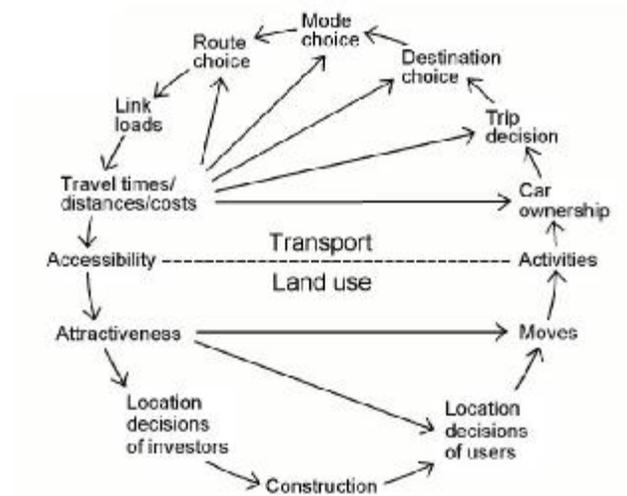
Mainly descriptive studies of urban energy use

- e.g. Dhakal's (2009) study of energy use and carbon emissions in Chinese cities

## Approaches: land use and transport models

Typical features:

- District spatial scale
- Dynamic temporal scale
- Econometric simulation methods
- Endogenous supply and demand



Source: Wegener (2004)

Not normally thought of as urban energy models

- Historic interest in transportation energy but growing focus on stationary sector
- e.g. Wegener (2004) for a review, Ghauche (2010) for new interests

## Challenges: model complexity and integration

- Complexity
  - Uncertainty in model parameters and connections
  - Computational issues (e.g. optimizations taking multiple hours to solve)
- Integration, lack thereof
  - Connections between modelling sectors are largely piecemeal
  - e.g. climate model linked to building model, transport model linked to air pollution model

## Challenges: policy relevance

- Policy analysis models have limited view of policy effectiveness and sectoral interactions
  - e.g. Add x thousand solar roofs, insulation measures etc. This may lower heat demand but what about rebound effects? Impact on energy supply system?
- Only land use and transport models begin to capture the direct and indirect effects of a policy intervention

## Challenges: data availability and quality

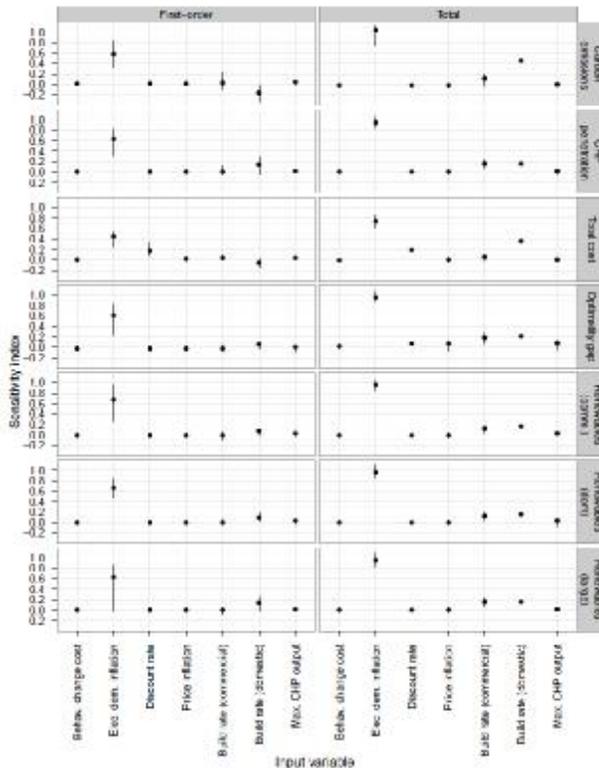
In a recent survey of energy modelling academics\*:

- 68% said input data was difficult or very difficult to acquire
- Only 26% share model output data freely (most aggregate it into papers, or have commercial confidentiality constraints)
- 44% use formal data standards (e.g. ontologies, ISO or IEEE specs, etc.)
- Respondents lamented “a lack of easily extensible/adaptable ontologies”

\* Keirstead and van Dam (2011)

## Opportunities: sensitivity analysis & cloud computing

- Existing literature rarely uses sophisticated sensitivity analysis; often just one-at-a-time variable changes



- Global sensitivity analysis methods promising but rely on Monte Carlo simulation
- Cloud computing to handle load?

## Opportunities: data collection and integration

- Development of standard middle-level ontologies?

**Domestic gas boiler (20 kW)** (instance of ConversionPr...

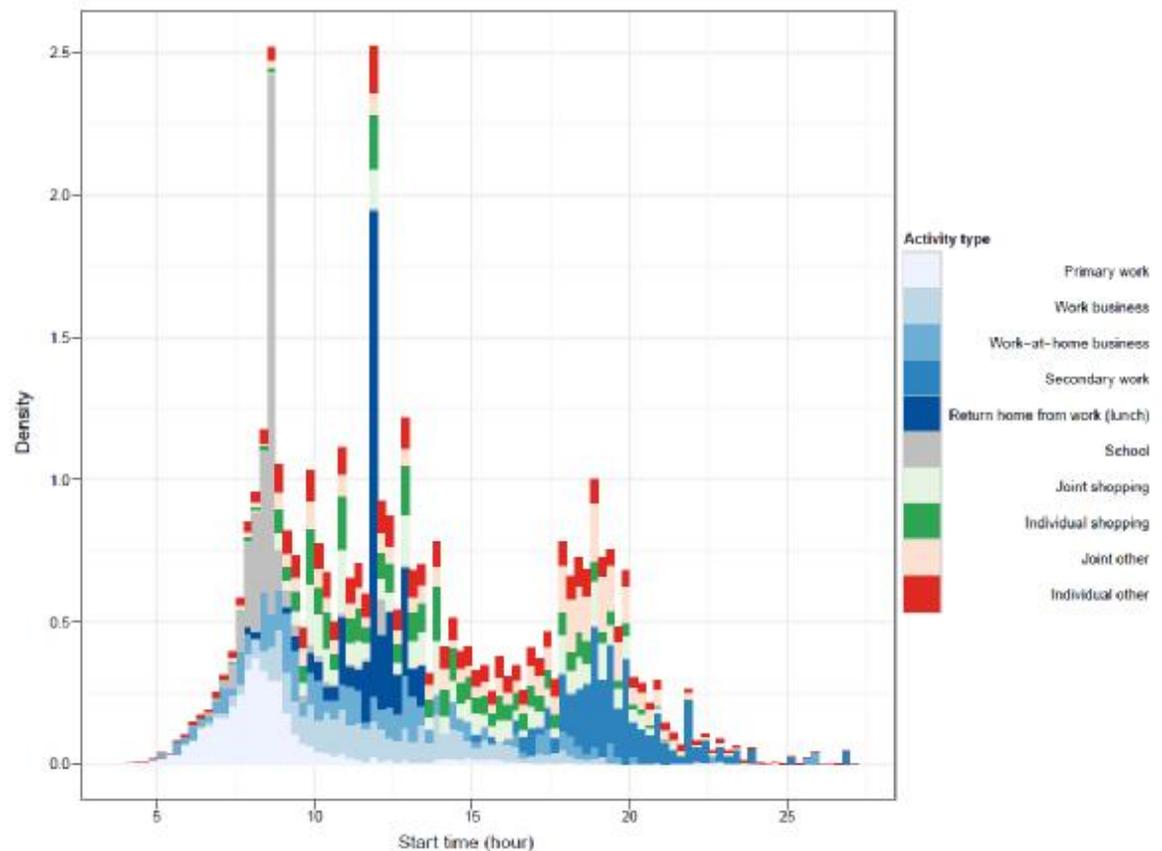
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Game Name	boiler	Has Discount Ra	0.06
<input type="checkbox"/> Include Layout		Has Loan Period	15.0
<input checked="" type="checkbox"/> Include RTN		Has Operation Ir	0.0 kilowatt to 20.0 kilowatt (boiler
Max Allowed	100		
Has Footprint	1.0 square meter		

**domestic gas boiler (20kW)** (Instance of Technology, Inter

Label	
domestic gas boiler (20kW)	
Possible Operational Configurations	
boiler process	
Current Operational Configuration	
boiler process	
Current Operational Scale	Status
0.0	Operational
Design Properties	Physical Properties
min 0.0 kW max 20.0 kW	area 1.0 m <sup>2</sup>
Economic Properties	
price GBP 1050.0 lcan 15.0 year operating cost 100.0 GBP_per_year	
In Edges	
ownership household domestic gas boiler (20kW)	
Out Edges	

## Opportunities: integration via activity-based modelling

- Human activities drive energy consumption
- Activity-based simulation methods as foundation for policy-responsive models



## Conclusion

- Understanding urban energy consumption is vital to addressing wider energy and climate challenges
- Wide variety of methods currently used, at a range of scales
  - Common difficulties in capturing interactions between sectors, indirect policy effects, data access and uncertainty
- Opportunities include improved methods, such as use of sensitivity analysis and ontologies, and model integration via activity-based simulation

## Questions?

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