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**URBAN FLOWS**  
OBSERVATORY

**RISE**  
Resources,  
Infrastructure  
Systems & built  
Environments

# Multi-Scale, circular economic potential of a nation's building stock

Dr Danielle Densley Tingley, Lecturer in Architectural Engineering, Civil and Structural Engineering Department

# Long Term Research Vision

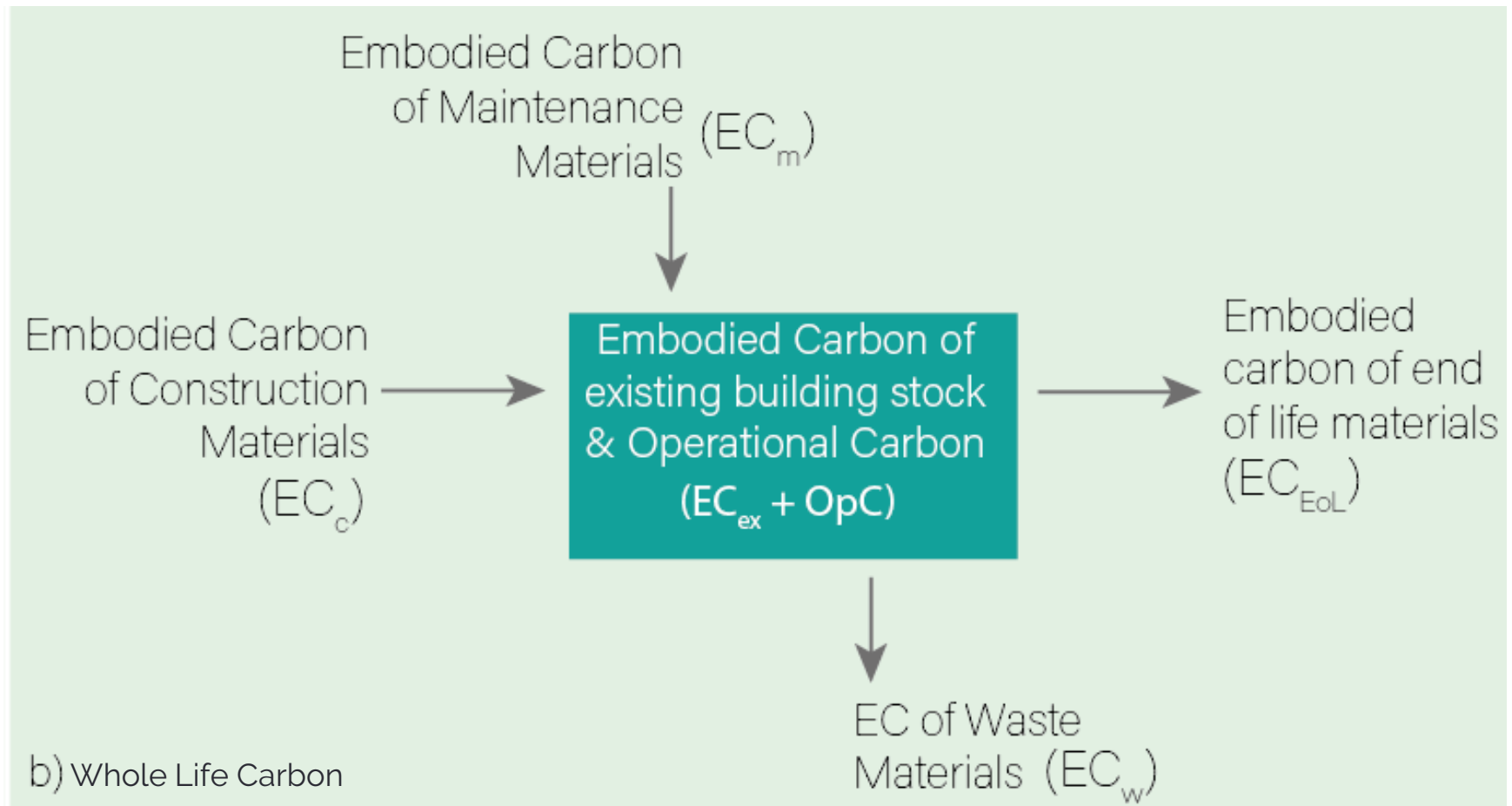


- Generate detailed, multi-scale understanding of material flows and stocks in the built environment
- Provide evidence & estimates of opportunities for embodied carbon reduction & circular economic flows
- Leverage CE opportunities to develop component/material reuse/recycle roadmaps to reduce demand for new materials
- Inform design of individual buildings & local and national planning policy

# Resource Efficient Cities & Nations

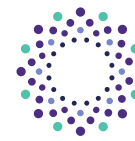


# Interdependencies of Material & In-use Energy Systems (long term goal)





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# Urban Flows Observatory Sheffield Case Study

[urbanflows.ac.uk](http://urbanflows.ac.uk)

[@urbanflowsObs](https://twitter.com/urbanflowsObs)

# What is Sheffield made of?

- What materials & where?
- – Using MARVeL (Multispectral Advanced Research VEHicLe) to capture remote sensing data & applying machine learning

Also, need to know:

- New build rate, construction types & material demand
- Where are unused buildings?
  - How could these be repurposed?
- Demolish rate & construction types
  - Reuse potential

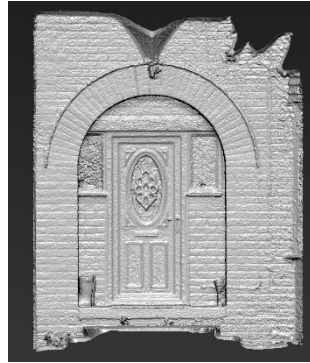


# MARVeL

## Multispectral Advanced Research Vehicle

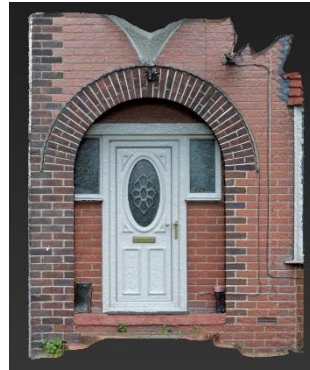
### LiDAR Unit x 4

- 100m Range
- Up to 600,000 Points per Second



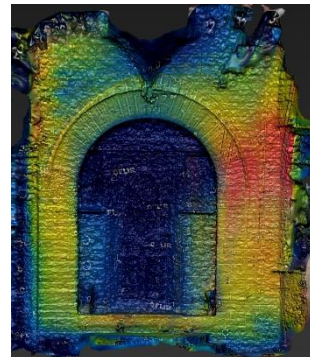
### Visual Camera Unit

- A 360° spherical camera, 90% of full sphere.
- 30 MP (5 MP x 6 sensors)

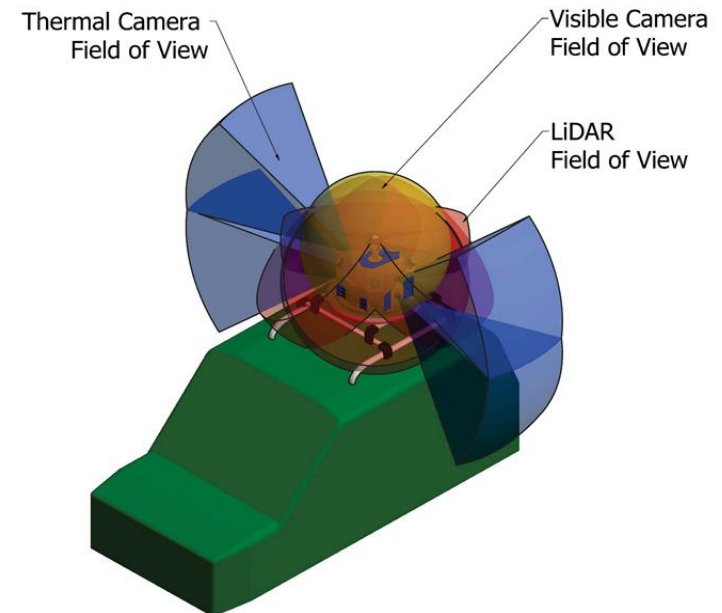
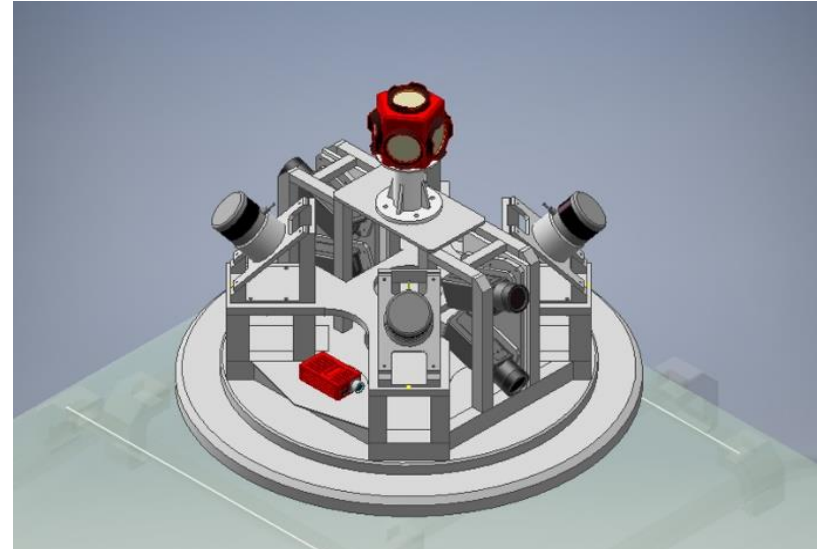


### Thermal Camera x 4

- Resolution of 640 x 512



### Hyperspectral Camera Spec TBC





# Machine Learning Workflow

ML can recognise buildings and materials.

ML cannot currently recognise IR image.

Initial training with Tensorflow successful.

ML workplan in development.

## Tensorflow



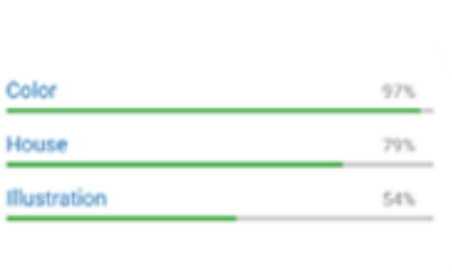
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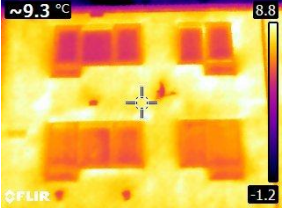


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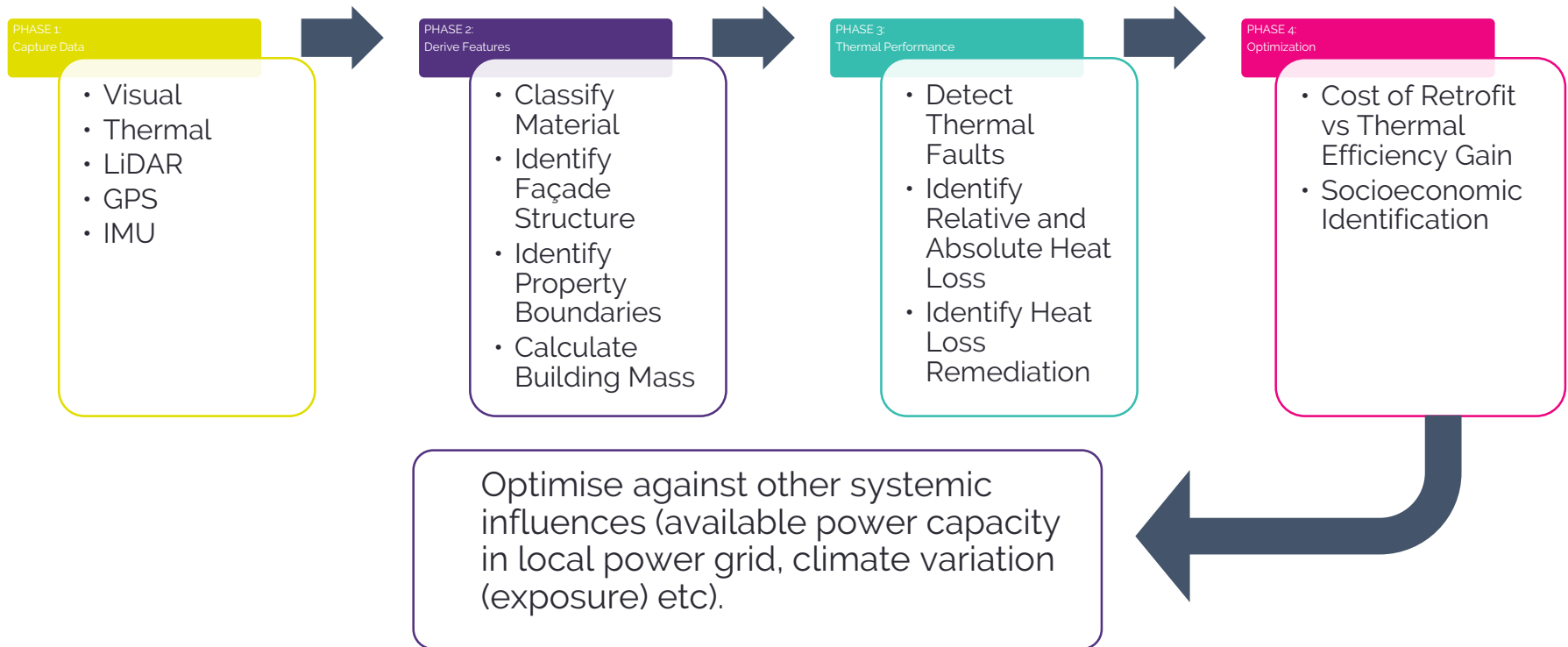


FOUR WINDOWS TESTS							
5	FLIR0009.jpg		Four windows but of different shapes.	0.11753	0.88247	0.01661	0.98339



# Overview

Develop an “integrated mobile sensing platform that creates high resolution, multi-spectral 3D urban surface maps, to classify materials and thermal performance, and prioritise retrofit investment.”



# Phase 1: Capture Data

Develop an integrated mobile sensing platform to collect visual, thermal and 3D image capture (i.e. laser scanning) data.



Visual

Thermal

LiDAR

## Phase 2: Derive Features

Develop a workflow for automatic detection of buildings with heterogeneous appearance, classification of building materials and identification of building façade structures.





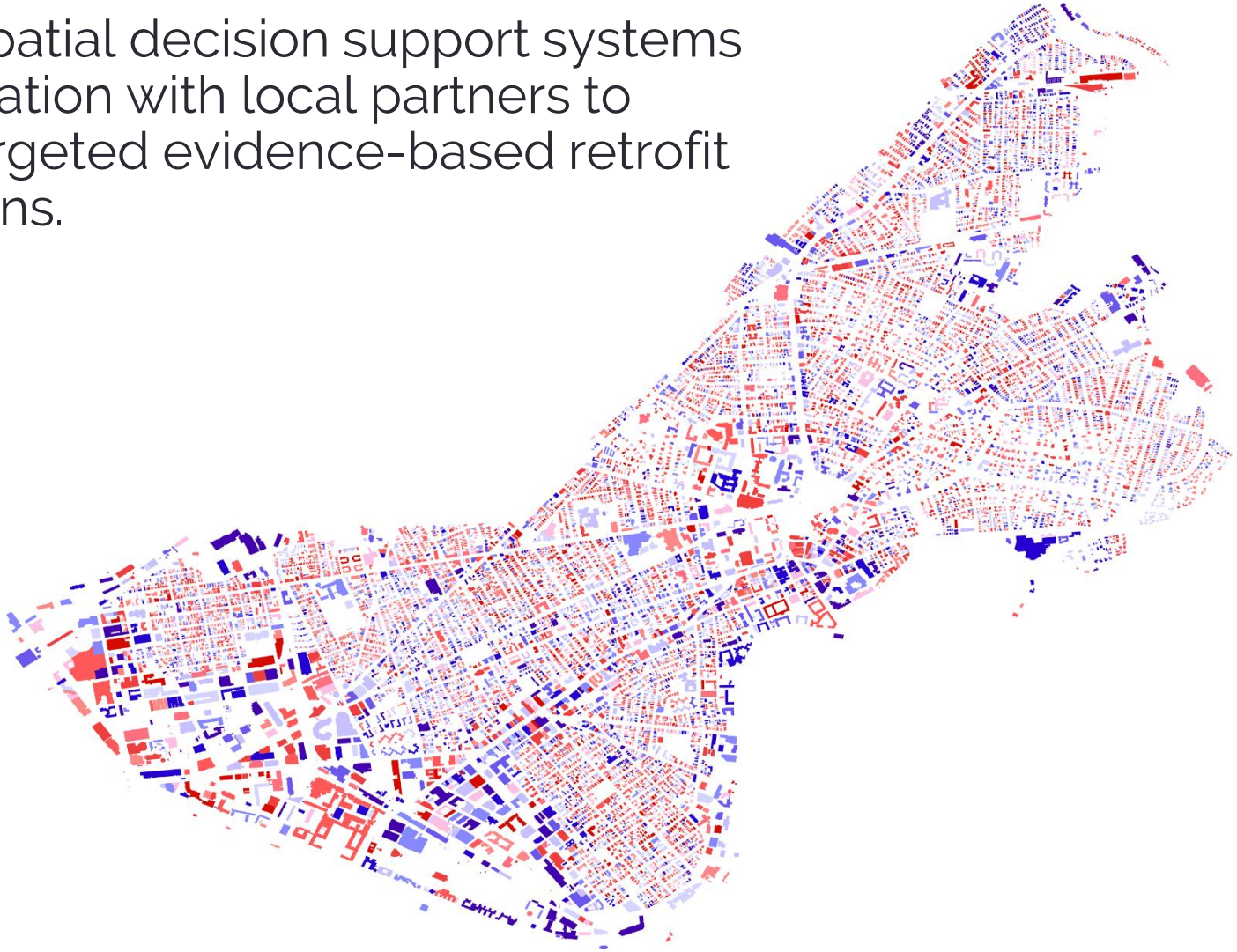
# Phase 3: Thermal characteristics

Develop a workflow for automatic classification of the thermal characteristics of the built environment.



# Phase 4: Optimisation

Develop spatial decision support systems in collaboration with local partners to support targeted evidence-based retrofit interventions.



# Cataloguing City Assets

- 475,000 bricks in a street
- 75% of area pre-1925 construction, 3% 1925-1955, 22% Post 1955
- Can estimate that 364,800 bricks could be salvaged in the future
- Price of a new face brick approx. 75p
- Asset value: £273,600
- Embodied Carbon stock: 200,640 kgCO<sub>2</sub>

Age	Mortar types in Europe	Assumed reusability
Pre-1925	Likely to be lime mortar	100%
1925-1955	Could be lime, cement, or a mixture	60%
Post-1955	Likely to be cement	0%

# Understanding 'What Sheffield is made of' leverages:

- An estimation of the **circular economic potential** of current stocks
  - Identification of buildings with high reuse potential – deconstruct rather than demolish
- An understanding of how embodied carbon is distributed across the city
  - **Maintain asset value** of buildings with high embodied carbon – extend life & retrofit
- **Adapt disused space** instead of new build
  - Reduce material demand



# Multi-Scale CE of Non-Residential Stock

(Research Proposal Under Review)

# Circular Economy Across Scales

Building  
Level  
Stocks

City Level  
Stocks

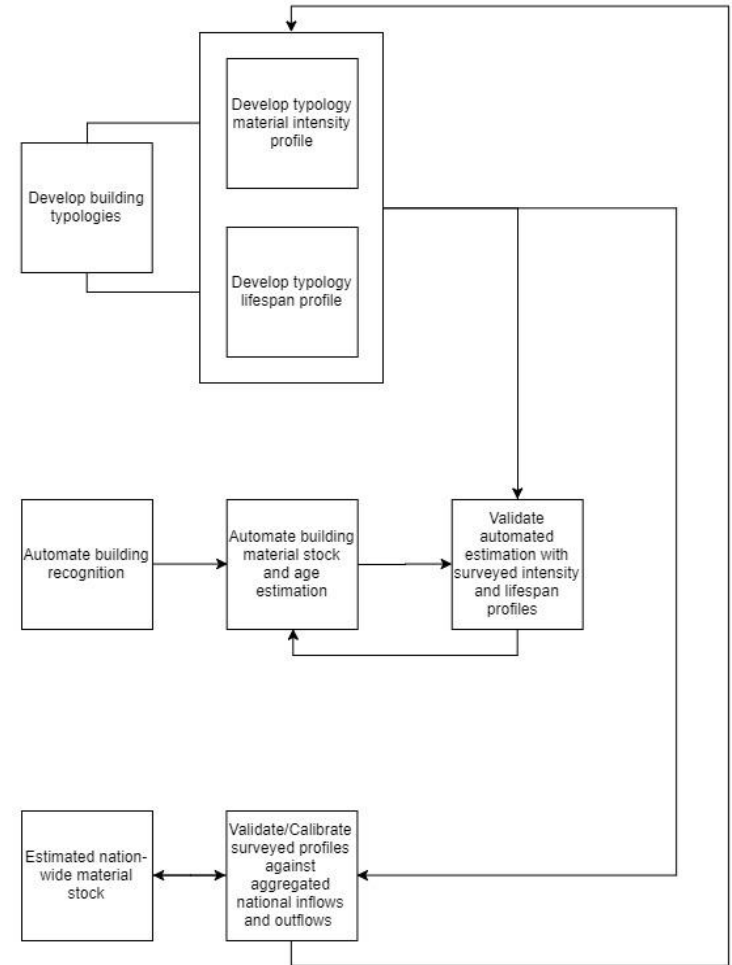
National  
Stocks

Bottom up MFA of  
Case Study  
Buildings, assess:  
material intensity,  
embodied carbon  
& CE potential

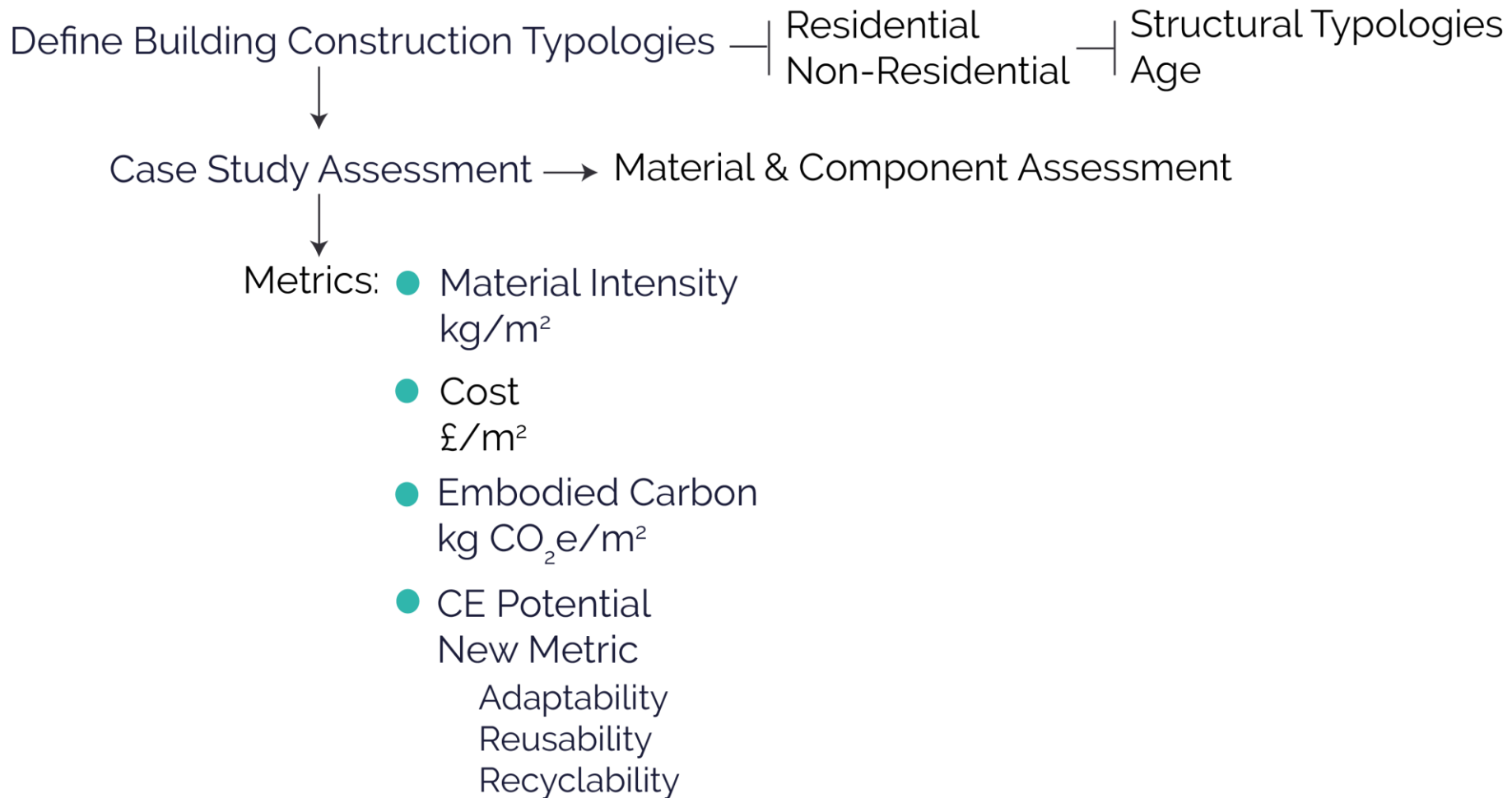
Estimate city level  
material stock –  
comparison with  
Urban Flows  
Sheffield  
assessment

Extrapolate country  
wide UK stocks

Demand Modelling  
to predict future  
material demand –  
what % could  
outflows meet?



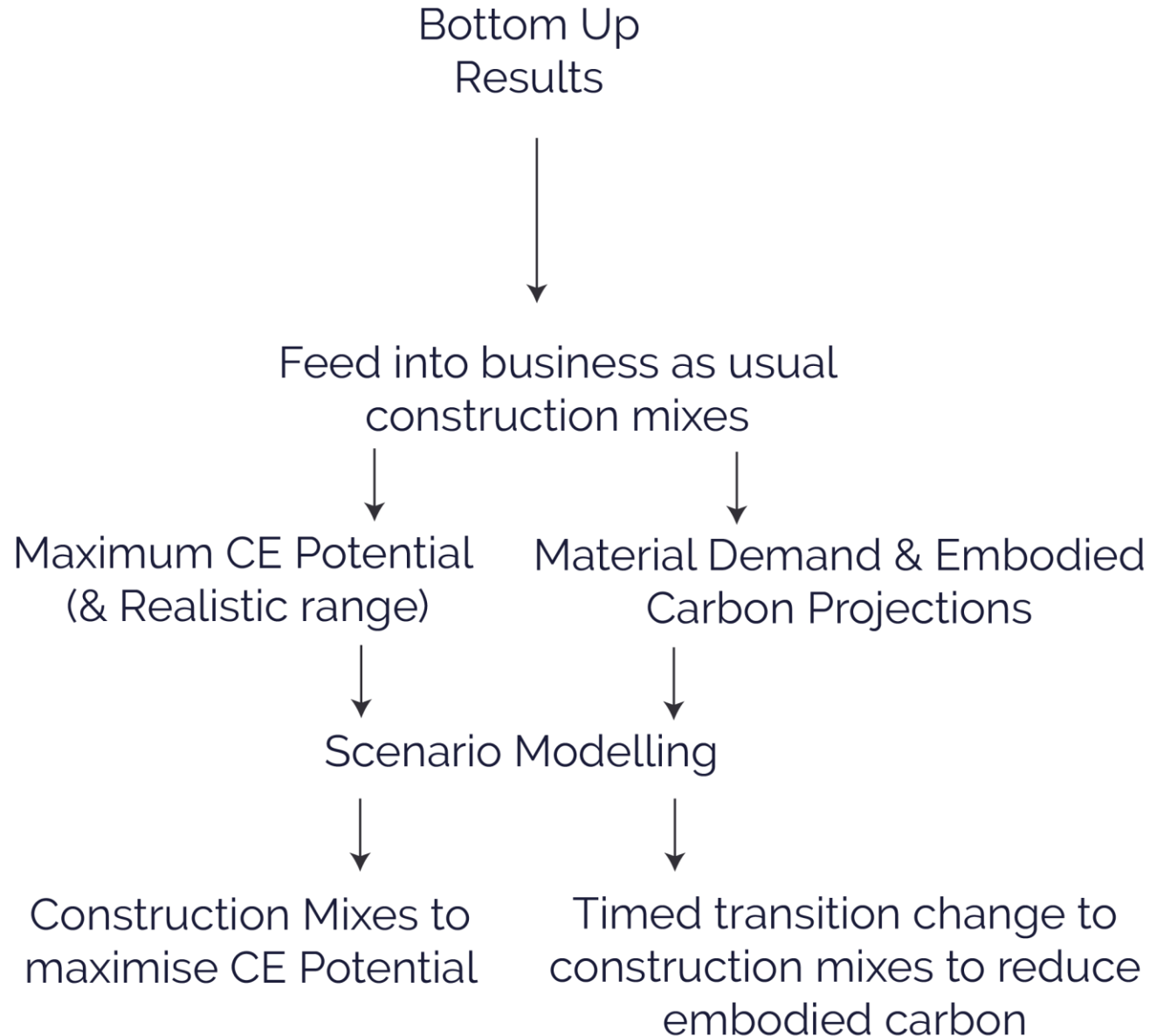
# Bottom-up MFA



# City Level Approach

- Sheffield, UK case study
- Cross-validation – bottom-up modelling with Urban Flows Remote Sensing Data (particularly façade materials)
- Compare high resolution remote sensing data with satellite data
  - can you apply machine learning techniques to satellite data to automate recognition of roof & façade materials?

# Future Demand Modelling



# Key Research Questions

- Is a national stock model representative of individual cities? Or do different cities have their own typology patterns?
- How does the building stock affect a country's consumption patterns?
- To what extent could CE reduce a country's built environment material consumption?
- What are the impacts & future implications of built environment resource consumption on a country's carbonisation pathways?

# Key Planned Outcomes

- Multi-scale framework developed & applied to UK non-residential buildings
- Understanding of relationship between individual building design & long term material demand projects & embodied carbon for construction in UK
- Implications for building design
- Implications for local & national planning

