

# Heat 4 All

## **Application of Optimisation Model in Heating Decarbonisation**

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# Net-Zero heating

# 2019

Emission of building sector: 91 MtCO<sub>2</sub>e

13%

5%



of the UK's total heat demand in buildings is currently met by low carbon sources<sup>2</sup>.

of the UK's total GHG emissions

*residential buildings*<sup>1</sup>, accounting

for 50% building sector emission.

comes from *direct CO*<sub>2</sub> of

2050 Projected emission of building sector: 1 MtCO<sub>2</sub>e



# 55%

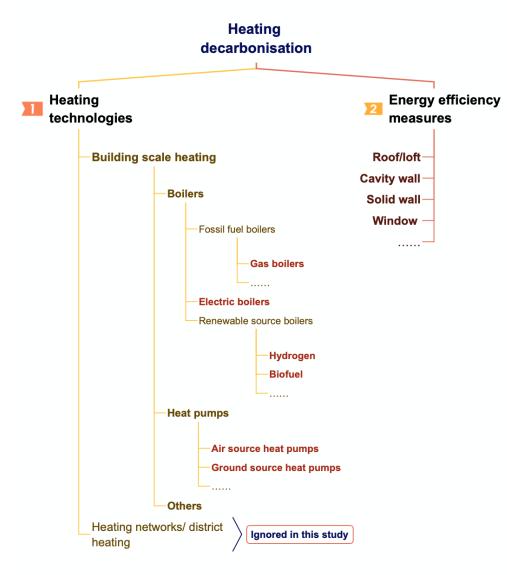
of emission reduction in building sector will come from *residential building-scale low carbon heating*<sup>3</sup>.

# **5%**

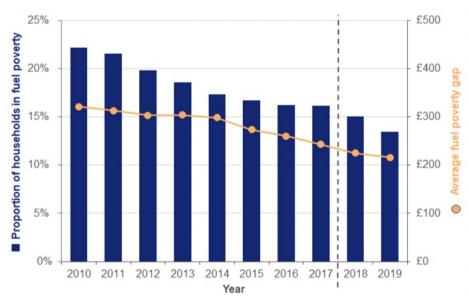
of emission reduction in building sector will come from *residential energy efficiency improvement*<sup>3</sup>.

Committee on Climate Change, 2019. Net Zero. Technical Report.
Committee on Climate Change, 2019. UK housing: Fit for the future?
Committee on Climate Change, 2020. The Sixth Carbon Budget - The UK's path to Net Zero.





# **13.4%** of households of the UK (3.18 millions households) are classified as fuel poor<sup>[1]</sup>.



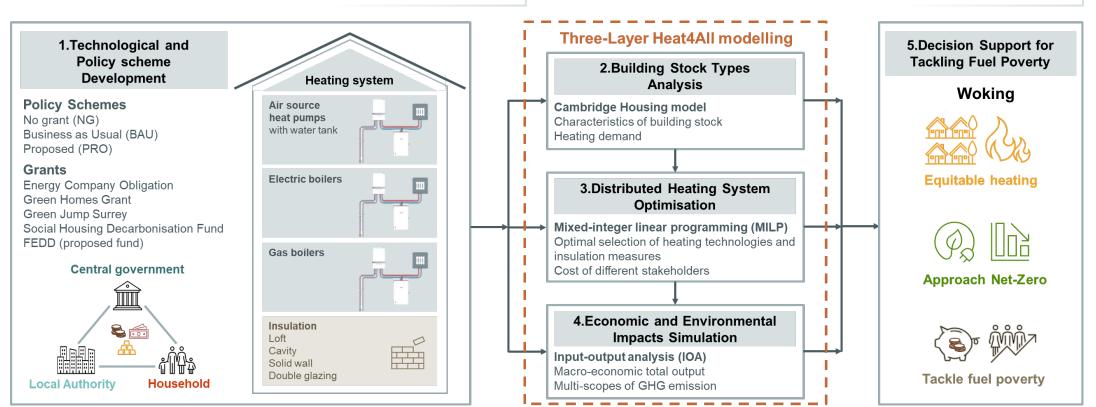
Costs of heating system optimisation and current fluctuation of energy price remind policymakers to propose careful decarbonisation strategy to avoid exacerbating fuel poverty.

1 Annual fuel poverty statistics report, 2021



### Aim 1

- Establish a systematic analysis framework of
- heating decarbonisation to minimise fuel poverty



Aim 2

Perform a case study and propose

technological and policy solutions



#### **Three-Layer Heat4All modelling**



**Cambridge Housing model** Characteristics of building stock Heating demand

#### 3.Distributed Heating System Optimisation

**Mixed-integer linear programming (MILP)** Optimal selection of heating technologies and insulation measures Cost of different stakeholders

#### 4.Economic and Environmental Impacts Simulation

Input-output analysis (IOA) Macro-economic total output Multi-scopes of GHG emission

#### Cambridge housing model

- provide characteristics of building stock collected in UK housing survey
- simulate the heating demand before and after retrofitting heating decarbonisation measures for each building

#### **Objective function of MILP model:** Minimise household cost

- □ Social housing: energy bills
- Other Building stock: Energy bills + Capital investment Grant support
- **Constraints:** Emission reduction targets, Grant budget, etc

#### Input-output analysis

- □ 4 sectors, electric equipment, construction, gas and electricity are directly related with heating system decarbonisation
- □ Changes in their **final demand** brings about whole system impacts



# **Objective Function: Minimise household cost**

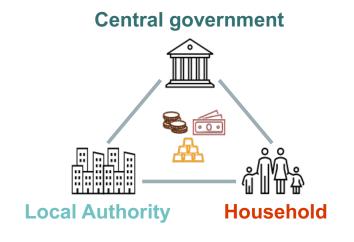


Energy bills



Other building stock

Energy bills + Capital investment – Grant support





# **Decision variables: retrofit options**



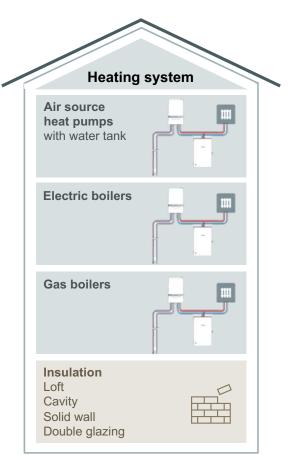
## Heating technologies

3 options of gas boilers, electric boilers and heat pumps

## $\sum$

## **Energy efficiency measures**

Multiple options of retrofits for loft, cavity, solid wall and double glazing



# Distributed heating system optimisation

## Heating technologies

ASHP	Listed capacity (kW)	$\begin{array}{l} \textbf{CoP at } T_t^{amb} = \\ 2^{\circ}C \end{array}$	CC <sup>pump</sup> ( <b>£</b> )	T <sub>p</sub> <sup>ws</sup> (°C)
HP50	5.0	1.98	2333	55
HP60	6.0	2.45	3053	55
HP85	8.5	2.30	3577	55

Hot water tank	$V_{\mathrm{k}}$ (L)	CC <sub>k</sub> <sup>Tank</sup> (£)	H <sup>loss</sup> (kW)
150L	150	1510	0.048
170L	170	1565	0.051

Boiler	cap <sup>boiler</sup> (kW)	CC <sup>boiler</sup> (£)	$\eta_b$	Туре
7E	7	1030	1.000	Electric
11E	11	1110	1.000	Electric
12E	12	1439	1.000	Electric
24G	24	811	0.911	Gas
25G	25	744	0.891	Gas
30G	30	852	0.891	Gas

## Energy efficiency measures

Insulation form	Detached $C_{i,j}^{ins}$ (£)	Semidetached $C_{i,j}^{ins}$ (£)	End-terrace $C_{i,j}^{ins}$ (£)	Mid-Terrace $C_{i,j}^{ins}$ (£)	Flat C <sup>ins</sup> (£)
Loft	525	438	438	350	N/A
Cavity	534	416	416	341	N/A
Solid wall	4189	3281	3281	2188	N/A
Double glazing	7100	5950	5950	4450	3000



## Constraints



## **Emission reduction target**

Direct emission reduction of heating system (gas + electricity)



## Grant eligibility and budget

Energy Company Obligation Green Homes Grant Green Jump Surrey Social Housing Decarbonisation Fund FEDD (proposed fund)



# Policy schemes and grant eligibility

Grants	GHG-GJS	ECO	SHDFd	SHDFe	FEDD
Applicable policy schemes					
NG	-	-	-	-	-
BAU	+	+	+	+	-
PRO	+	+	+	+	+
Grant details					
Eligible EPC	E,F,G	E,F,G	D	E	D,E,F,G
Household Limit	£15,000	£10,000	£10,000	£12,000	N/A
Case Study Limit	£300,734	N/A	£402,073	£482,488	N/A
Heating technologies					
Gas Boilers	-	-	-	-	
Electric Boilers	-	-	-	-	S
ASHPs	Р	-	S	S	S
Hot water tanks	-	-	-	-	S
Energy efficiency measures					
Loft	Р	Р	Р	Р	Р
Cavity	Р	Р	Р	Р	Р
Solid wall	Р	Р	Р	Р	Р
Double glazing	-	Р	Р	Р	Р
Nata					

Note:

1: 'P' indicates Primary and 'S' indicates Secondary measures.

2: Green Jump Surrey is a county addition to the Green Homes Grant, the two are combined into one grant for modelling purposes. Budget limitations for the Social Housing Decarbonisation Fund differ based on the dwelling's EPC rating. Hence, the fund is divided into two individual grants.



## 456000 Scenario

Future policy scheme 3

Minimum emission reduction target (ERT) 25 (0-100%)

Projected carbon intensity of grid (GCI) 16 (0-15 gCO2e/kWh)

Projected future natural gas prices 19 (0.01-0.1 £/kWh)

Projected future electricity prices 20 (0.1-1.5 £kWh)



## **Output of each scenario**

Optimised retrofitting plan

Costs of different stakeholders

Impacts on industry sectors and total outputs

Impacts on multi-scopes of GHG emissions



# Case study in Woking 1658 social housing dwellings

## **BAU policy scheme**

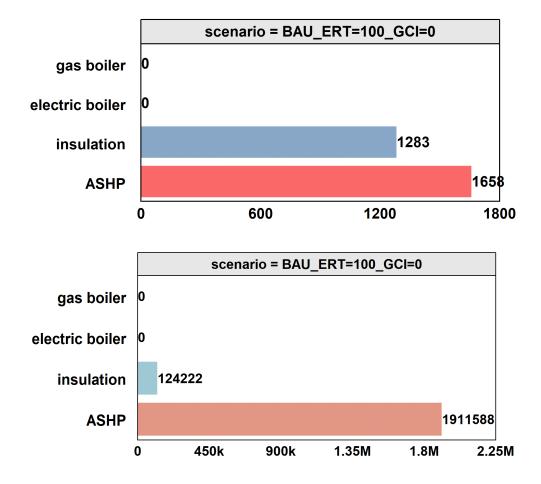
**100 %** GHG emission reduction

 $\mathbf{0}$  gCO<sub>2</sub>e/kWh

0.231 £/kWh future electricity price

0.055 £/kWh future gas price





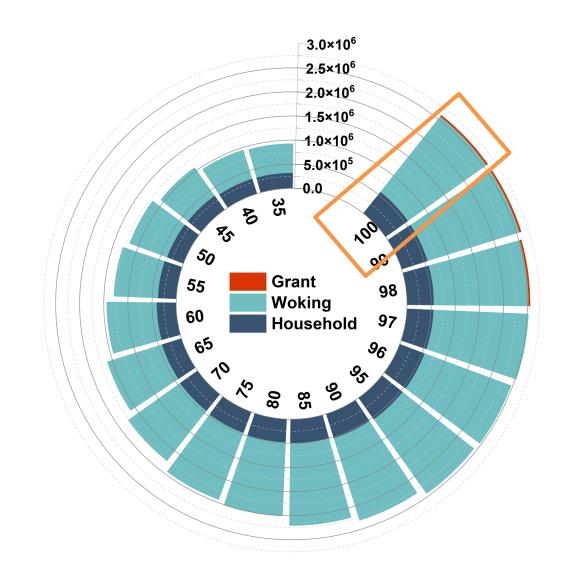
#### Installation numbers in total

Only heat pumps are selected

#### Annualised retrofitting costs

• heat pumps: £ 1.91 million

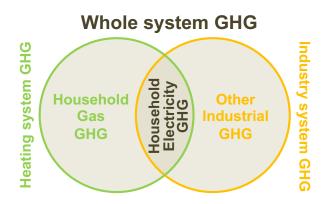




#### Annualised cost of stakeholders (£)

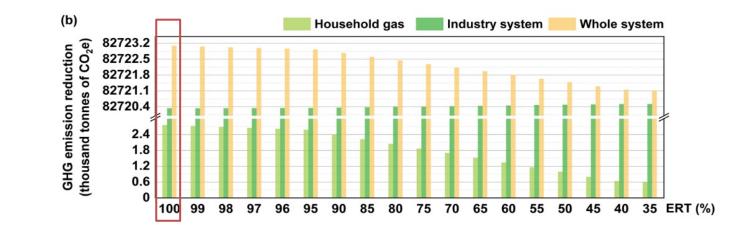
Current grants contribute to very limited part of capital investments (mainly in air source heat pumps)

# Whole system GHG emissions



Heat

**4AI** 



Multiple scopes of GHG emissions (thousand tonnes of CO<sub>2</sub>e)

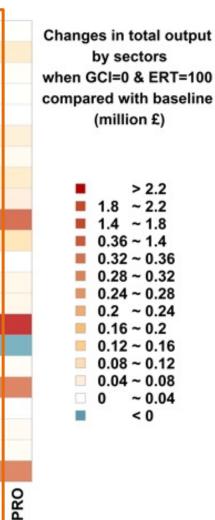
Whole system emission reduction: 82723

- <u>Household gas</u> : 2.760
- <u>Household electricity</u> : 0.805
- *<u>Industry system</u>* : 82720, dominating emission reduction of whole system



# Impacts on industry sectors

**1 Aggriculture** 2 Mining 3 Manufacture of food 4 Other primary manufacturing **5** Refined petroleum **6** Chemical products 7 Construction materials 8 Metal 9 Fabricated metal products **10 Electrical quipment 11 Machinery and equipment 12 Transport equipment** 13 Other advanced manufacturing 14 Repair and installation **15 Eletricity** 16 Gas 17 Water and waste **18 Construction 19 Wholesale & retail 20 Transport services** 21 Housing services 22 Other services



BAU

g

## Total output by sectors

- Only Sec16(Gas) decreases
- Stronger increases in

Sec10(Electrical equipment),

Sec15(Electricity), and

Sec18(Construction)



# Impacts on industry sectors

### Direct GHG emission by sectors

Trends are similar to changes in total output, but sectors have various emission factors.

- Sec15(Electricity): huge changes in GCI (187 to 0 gCO<sub>2</sub>e/kWh).
- Sec16(Gas): decreased gas consumption.

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Changes in direct GHG emission of industry system by sectors when GCI=0 & ERT=100 compared with baseline (thousand tonnes CO<sub>2</sub>e)

	> 0.025
0.023	~ 0.025
0.02	~ 0.023
0.018	~ 0.02
0.015	~ 0.018
0.013	~ 0.015
0.01	~ 0.013
0.0075	~ 0.01
0.005	~ 0.0075
0.0025	~ 0.005
0	~ 0.0025
-0.5	~ 0
	< -0.5

BAU

PRO



# Impacts on industry sectors

BAU

PRO

g

**1** Aggriculture 2 Mining 3 Manufacture of food 4 Other primary manufacturing **5** Refined petroleum **6** Chemical products 7 Construction materials 8 Metal **9** Fabricated metal products **10 Electrical guipment 11 Machinery and equipment 12 Transport equipment** 13 Other advanced manufacturing 14 Repair and installation **15 Eletricity** 16 Gas 17 Water and waste **18 Construction** 19 Wholesale & retail **20 Transport services 21 Housing services** 22 Other services



## Indirect GHG emission by sectors

- Trends are different from changes in direct GHG
- Decreases in all sectors because of huge changes in GCI (187 to 0 gCO<sub>2</sub>e/kWh)



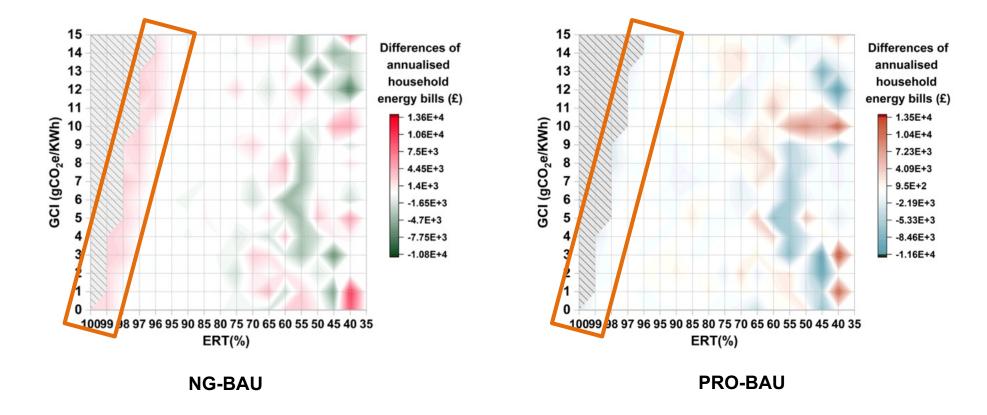
# Discussion

**Policy schemes** 

**Energy Prices** 



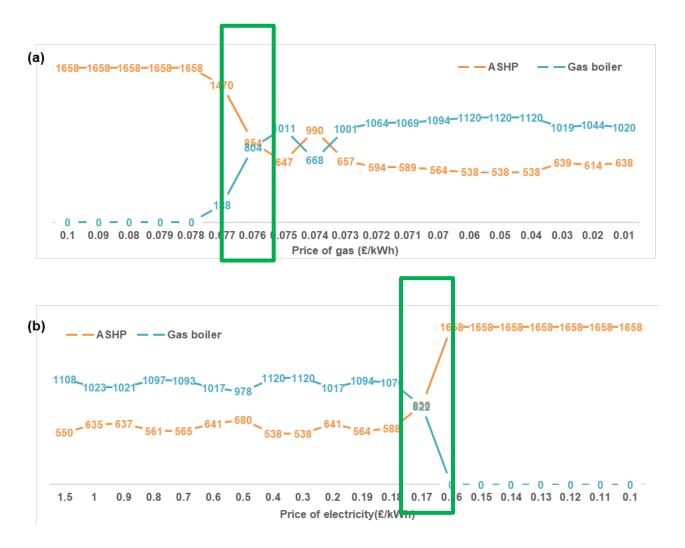
### When comparing different policy schemes



When ERT is close to the upper limit, PRO provides the cheapest plan for households, followed by BAU and NG.



#### When electricity price is 3 times of gas price...



Sensitivity of

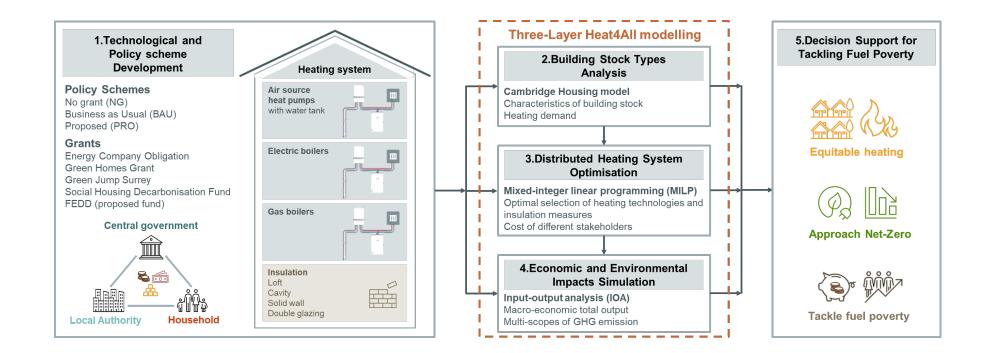
- (a) gas price when GCI is 15 gCO<sub>2</sub>e/kWh, ERT is 60%, and price of electricity is 0.231 £/kWh under PRO;
- (b) electricity price when GCI is 15 gCO<sub>2</sub>e/kWh, ERT is 60%, and price of gas is 0.055 £/kWh under PRO



**MILP** helps tackle heating decarbonisation and fuel poverty at community level

**Three-layer Heat4AII** integrates MILP optimisation and explored wider system impacts of heating decarbonisation

**Future works** could integrate decarbonised electricity system, and polish grants design, etc.





Future Equitable Decarbonised Distributed Heating system

