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Identifying trends in the use of domestic appliances from household electricity consumption measurements

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Abstract

Results are presented from a monitoring study of the electricity consumption of a sample of UK domestic buildings. Five-minutely average whole house power consumption was recorded for 72 dwellings at five sites over a 2-year monitoring period. The mean annual electricity consumption for the households increased significantly by 4.5% (t = 1.9; p < 0.05, one-tailed) from the first to the second year of monitoring. New techniques are developed which estimate the electricity consumption of different appliance groups, based on analysis of the five-minutely monitored data. The overall increase in electricity consumption is attributed to a 10.2% increase in the consumption of 'standby' appliances (such as televisions and consumer electronics) and a 4.7% increase in the consumption of 'active' appliance (such as lighting, kettles and electric showers). The consumption of different energy user groups (low, medium and high) is also investigated and low and high users are identified as contributing to the overall increase in consumption. The need for further investigation, such as quantitative and qualitative studies, to improve understanding in domestic electricity consumption is discussed.

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1. Introduction

Electricity consumption in domestic buildings is determined by two main factors: the type and number of electrical appliances in the property; and the use of these appliances by the occupants of the building. In houses with similar built forms there can be a wide range of different appliances in use and these appliances will have a range of different power consumptions. Occupants influence the electricity use of a dwelling both by their purchase of electrical appliances and through their use of these appliances. The variation in the type of electrical appliances present and the occupant's semirandom use of these makes domestic electricity consumption difficult to predict with accuracy, particularly at short time steps such as an hour or less. However, it is recognised that a sound understanding of domestic electricity consumption is required for the design and implementation of energy efficiency measures [1] and on-site electricity generation [2].

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The UK Government's Climate Change Bill in 2007 sets a legally binding target of a 60% reduction in national CO_2 emissions by 2050 compared to 1990 levels [3]. Electricity consumption from housing represented 29% of total UK electricity consumption in 2005 [4]. Schemes to reduce domestic electricity consumption include technical measures, such as low energy lighting and the energy labelling of appliances [5], and measures designed to influence the occupants' behaviour, such smart metering [6]. The main aim of smart metering is to encourage consumers to use less electricity through being better informed about their consumption patterns. The consumption of carbon-intensive mains electricity can also be avoided thorough the use of on-site micro-generation systems which produce low carbon electricity at the dwelling itself. The UK Government's Low Carbon Buildings Programme provides grants to install microgeneration systems such as solar PV, micro-wind turbines and combined heat and power units [7]. However, the penetration of low energy appliances, smart metering and micro-generation is currently limited and the average household domestic electricity consumption has increased by 1.2% between 2000 and 2004 [8]. This increase has occurred at a time when the efficiency of new household electrical goods, such as

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Nomenclature

- n_{1-4} number of P_{1-4} values in the 01:00 to 04:00 time period
- P_{1-4} five-minutely average electric power consumption of the household recorded between 01:00 and 04:00 (W)
- \overline{P}_{ACTIVE} daily average electric power consumption of the active appliances and the standby appliances in use (W)
- $\overline{P}_{\text{COLD}}$ daily average electric power consumption of the cold appliances (W)
- $P_{\text{CONTINUOUS}}$ five-minutely average electric power consumption of the continuous appliances (W)
- $P_{C\&S}$ five-minutely average electric power consumption of the continuous appliances and standby appliances in standby mode (W)
- $\overline{P}_{C\&S}$ daily average electric power consumption of the continuous appliances and standby appliances in standby mode (W)
- P_{EXPORT} five-minutely average electric power exported to the mains grid (W)
- P_{IMPORT} five-minutely average electric power imported from the mains grid (W)
- $P_{\rm PV}$ five-minutely average electric power generation by the photovoltaic system (W)
- P_{STANDBY_MODE} five-minutely average electric power consumption of the standby appliances in standby mode (W)
- P_{TOTAL} five-minutely average electric power consumption of the household (W)
- $\overline{P}_{\text{TOTAL}}$ daily average total electric power consumption (W)

refrigeration and washing appliances, has improved considerably [9]. The reasons why this increase in overall domestic electricity consumption has occurred need to be clearly understood in order to develop future policy to reduce consumption from the UK housing stock.

National statistics provide annual totals of domestic electricity consumption, often as average values. UK Government delivered energy statistics show that the average UK household consumed 4068 kWh of electricity in 2004 [10]. The English House Condition Survey (EHCS) in 2001 collected metering data on 7370 households in England with an average annual electricity consumption of 5282 kWh [11]. These figures include the electricity used for hot water and space heating as well as the appliance consumption. The EHCS survey demonstrated how electricity use varies with the floor area of dwellings, household income and many other factors. However, such annual values do not provide sufficient detail for planning effective interventions such as the replacement of appliances or promoting behavioural change. More detailed studies with smaller sample sizes can provide greater insight to electricity consumption trends. For example, a 2007

longitudinal study of 15 UK dwellings found a 31.6% rise in electricity consumption over a 15 years period and identified the largest increases in the households with high annual consumptions [12].

Models have been used to predict the consumption of groups of appliances. The DECADE project provided national estimates for the consumption of groups of appliances based on ownership statistics and the average consumptions of the appliance stock [13]. For example, the breakdown of the national electricity consumption by appliance group in 2003 gives: lighting 20%; refrigeration appliances 18%; cooking appliances 17%; brown appliances (such as televisions, computers and communication devices) 21%; and wet appliances (such as washing machines, tumble dryers and dishwashers) 14%. At the individual household level the BREDEM model predicts monthly or annual total electricity use using algorithms based on total floor area of the dwelling and number of occupants [14]. No account of the occupant behaviour is used in BREDEM and the predictions are only intended to give an average household figure [15]. Load models have also been developed to predict individual household electricity consumption at 1 min or half hour intervals [16,17]. These models make predictions of energy consumption patterns for a typical household and do not reflect the large interdwelling variation that occurs in practice.

Monitoring studies can provide current data on individual household electricity consumption and such studies generally take two approaches. Monitoring equipment can be used to record the consumption of individual appliances or of collections of appliances. An example of this approach is a study by the Swedish Energy Agency which recorded appliance consumption data for 400 households [18]. This provided accurate consumption data on individual appliances and the results are of sufficient detail to make energy efficiency recommendations. The second approach is to monitor the whole house electricity consumption at a highresolution. A demand side management study in 1999 recorded one-minutely electricity load profiles for 30 homes over periods of 1-4 weeks [19]. The recorded loads clearly show the effects of different appliances on consumption levels. Similar monitoring studies in the non-domestic building sector have also been undertaken which identify consumption patterns based on whole building electricity measurements [20].

This work was undertaken as a part of the UK Carbon Reduction in Buildings (CaRB) project [21]. It investigates current trends in electricity consumption in UK dwellings through the analysis of recent field measurements. Novel analysis procedures have been developed to improve the understanding of domestic electricity consumption based on high-resolution five-minutely measurements of household electricity consumption. Seventy-two UK households are studied and the energy consumption of appliances with different consumption patterns is identified. The aim of this work is to improve the current understanding of electricity consumption in UK domestic buildings and to identify the trends in consumption of different appliance groups.

2. Household electrical appliance categories

The electricity consumption of a household is determined by the electric power consumed by each appliance and the amount of time each appliance is in use. In this study four categories of appliances have been identified according to their pattern of use: continuous appliances; standby appliances; cold appliances; and active appliances (Table 1). Continuous appliances, such as clocks and burglar alarms, draw a continuous constant amount of power. Standby appliances, in particular consumer electronic equipment such as televisions and set-top boxes, have three basic modes of operation: in use; on standby; or switched off. Standby use occurs when an appliance is not in use but is still consuming power [22]. Appliances can be on standby even when they appear to be switched off and the only certain way to prevent them drawing power is to disconnect their power supply. Cold appliances, such as fridges and freezers, are in continuous use however they do not draw a constant amount of power. Instead their power consumption cycles between zero and a set power level which is under thermostatic control. Active appliances are those which are actively switched on or off by the householders and are clearly either in use or not in use. Active appliances have no standby mode and when switched off their power consumption is zero. Examples of active appliances include lights, kettles and electric showers.

3. Household power consumption measurements

This study investigates the electricity consumption of 72 UK households (Table 2). The dwellings were part of a wider study researching photovoltaic (PV) systems installed on UK domestic buildings [27]. The households were clustered in five sites with each site containing between 10 and 22 properties. Four of the sites were social housing and the dwellings all had gas central heating. The built forms were detached houses, terrace bungalows, two-storey blocks and flats (e.g. Fig. 1). The electricity consumption of each dwelling was monitored for a 2-year period. Five-minutely average values of PV system electricity generation, import of electricity from the grid and export of electricity to the grid were recorded by current and voltage sensors and pulsed output meters. Data was collected using loggers installed in a number of the homes and was downloaded on a regular basis via the public telephone network. The data loggers had a constant power draw of 10 W and this power consumption was subtracted from the recorded household power consumption where necessary. The monitoring systems were funded by the UK Department of Trade and Industry under the PV Domestic Field Trial programme [28] and the energy consultants for the sites were Energy for Sustainable Development Ltd.

For each 5 min recording interval, average values of PV system electricity generation, import of electricity from the grid

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Appliance category	Category description	Example appliances	Typical in-use power (W)	Typical standby power (W)
Continuous	Continuously switched on and constant power consumption	Clocks ^a	2.5	_
		Burglar alarms ^b	5	_
		Broadband modems ^a	4	-
Standby	Actively switched on by householders. When not in use, power consumption may be non-zero.	Televisions—CRT ^a	84	3.5
		Televisions-LCD ^a	130	2.0
		Televisions—plasma ^a	253	2.7
		Set-top boxes ^a	17	8.0
		Audio HiFi ^a	14	8.2
		Mobile phone chargers ^a	4	2.8
		Desktop computer ^a	100	7.1
Cold	Continuously switched on and power consumption cycles between zero and a set power level	Fridges/freezers/fridge freezers ^{c,d}	80–250	8.8
Active	Actively switched on by householders. When not in use, power consumption is zero.	Kettles	2000-3000	_
		Electric hobs ^e	2500	_
		Washing machine ^e	2000	-
		Electric showers	4000-9000	_
		Lighting—CFL	9–13	_
		Lighting-incandescent	60-100	_

^a Figures from [23].

^b Figures from [24].

^c Figures from [25].

^d Figures from [26].

e Figures from [19].

Table 2 Site characteristics

Site	Number of dwellings	Built form	Tenure	Construction date	Monitoring period
1	22	Terrace bungalows	Social housing	2001	June 2002 to May 2004
2	13	Two-storey blocks and flats	Social housing	2001	February 2004 to January 2006
3	12	Flats (three-storey tower)	Social housing	2003	June 2004 to May 2006
4	15	Two-storey blocks	Social housing	2002	Nov 2004 to Oct 2006
5	10	Two-storey detached and semi-detached	Owner occupied	2003	Nov 2004 to Oct 2006

and export of electricity to the grid were recorded. The fiveminutely average total electrical power consumption (defined as the average power drawn by all the electrical appliances in the home during the 5 min period) was derived from the measurements using the following equation:

$$P_{\rm TOTAL} = P_{\rm PV} + P_{\rm IMPORT} - P_{\rm EXPORT} \tag{1}$$

4. High-resolution data analysis

4.1. Domestic electricity consumption patterns

For each dwelling, the electricity consumption recorded over the 2-year period contained over 200,000 individual data values. Standard spreadsheet software is not sufficient to analysis such data as there is, typically, a limit on the number of data entry rows allowable and a limit on the number of data points on graphs. Therefore, specialised software, the Interactive Data Language (IDL) software package, was used [29]. IDL is an array-based data processing package and can work with large datasets easily. A series of routines were developed in the IDL Development Environment to import, screen, store, analyse and display the monitored data (Fig. 2). These generic routines form part of an IDL application which can analyse time-series energy consumption data from any source and at any recording interval (such as 1 s intervals, 5 min intervals or half-hour intervals).



Fig. 1. Sample dwellings and photovoltaic systems at site 1 (left) and site 2 (right).



Fig. 2. Schematic of the IDL application generic routines.



Fig. 3. Five-minutely recorded total power consumption values for a single house over the 2-year monitoring period. The grey line shows the average values for each 5 min period.

The value of using high-resolution data in studying domestic electricity consumption patterns has been discussed elsewhere [30]. Most importantly, such data allows detailed insights which enable the categories of appliances (see Table 1) to be inferred. As an example, Fig. 3 shows the five-minutely electrical power consumption for a single house versus the time of day (00:00, 00:05, etc.). This figure shows over 200,000 fiveminutely values recorded in the 2-year monitoring period. Between midnight and 06:00 the total power consumption was always relatively low with an average value of 228 W. There were some high power consumptions (over 1000 W) in this time period and further investigation showed that these occurred only on three separate occasions when many of the appliances remained in use overnight. At around 06:00 the occupants began to actively use the appliances in the home and higher power consumptions were recorded. This continued until around 21:00 when power consumption levels started to return to their low, night time levels. For each 5 min interval the average total power consumption is shown by the grey line on the figure. This provides an indication of the daily pattern of consumption in the dwelling. It is clear however that this average profile is not at all representative of actual recorded data and in particular does not portray the very high, short-term power demands that occur.

From a more detailed inspection of the data, the operation of equipment in each of the appliance categories defined in Table 1 can be observed. Taking as an example the total power consumption values recorded at one house over a single day, the five-minutely average total power consumption shows a typical residential electricity use pattern (Fig. 4). During the early morning from 02:00 to 08:00 there was a constant cyclic pattern of power consumption between around 50 W and 180 W. The minimum power consumption of 50 W represents the power consumption of the continuously on appliances and the appliances in standby mode. The repeated increase up to 180 W was caused by the power consumption of the cold appliances and this pattern can be seen continuing through the day. After 08:00 the power consumption rose as other appliances begin to be used in the household. There were



Fig. 4. Five-minutely total power consumption recorded over a sample day at a single dwelling.

several high peaks above 1000 W which were caused by active appliances with high power consumption such as a kettle. After 17:00 there was a step-change increase of around 100 W in the power consumption values compared to the early morning which was probably caused by the use of active appliances such as lights and the switching on of appliances previously in standby mode such televisions and other consumer electronics.

Because the monitored data records the total power consumption of the dwellings, it was difficult to distinguish the contribution of individual appliances. The analysis techniques presented here infer, from the five-minutely data, the electricity consumption of three appliance consumption groups (based on the appliance categories in Table 1): the continuous appliances and standby appliances in standby mode; the cold appliances; and the active appliances including the standby appliances in use. It is worth noting here that the four categories give in Table 1 were chosen pragmatically for the purpose of categorising the features of domestic electricity use. The categories are not intended to offer a basis for classifying electrical appliances. A taxonomy of appliances is however being developed as part of the CaRB project [31].

4.2. Continuous and standby energy consumption

The first appliance consumption 'group' identified in the data is the combined total of the power consumption of continuous appliances and appliances left in standby mode. This power consumption was defined in this work as the continuous and standby power (C and S) and is given as

$$P_{C\&S} = \sum P_{CONTINUOUS} + \sum P_{STANDBY_MODE}$$
(2)

The power consumption of the continuous appliances and appliances left in standby mode can be observed from the minimum power consumption of the household in each day. As shown in Fig. 4 it is assumed that when this minimum power consumption occurred, there was no consumption from cold appliances, standby appliances in use or active appliances. Thus for each day the continuous and standby power consumption



Fig. 5. Monthly averages of continuous and standby power consumption for three sample houses at site 1.

$$(\overline{P}_{C\&S})$$
 is given by

 $\overline{P}_{C\&S} = \min(P_{TOTAL}) \tag{3}$

Monthly average continuous and standby power is shown for three sample houses at site 1 in Fig. 5. House A is an example of a household with a high continuous and standby power consumption of around 190 W. At house B there was a decrease in continuous and standby power between July and October 2003 from around 180 W to 50 W. This would be caused by a significant change in the presence or use of appliances in the home. House C had a low continuous and standby power consumption of around 30 W throughout the monitoring period. For each house, the daily continuous and standby electricity consumption was estimated by assuming that the values of continuous and standby power consumption remain constant throughout each day. For example a dwelling with a daily continuous and standby power of 50 W is calculated to have daily continuous and standby electricity consumption of 1.2 kWh.

4.3. Cold appliance energy consumption

The power consumption of cold appliances such as fridges was identified in the monitored data from the values recorded between 01:00 and 04:00. At this time it is assumed that there is little or no use of active appliances (as it is night time and the occupants are asleep) and power consumption is mainly caused by continuous and standby power and cold appliances. A plot of early morning power consumption against time of day for two samples dwelling illustrates the nature of cold appliance power consumption (Fig. 6). House A shows a cycling pattern from around 25 W to 175 W which occurred approximately every hour. The minimum value of 25 W was the continuous and standby power consumption and the increase to 175 W was caused by the power consumption (150 W) of the cold appliances. House B shows a similar cycle with power consumption varying between 0 W and 90 W which repeated approximately every 40 min.



Fig. 6. Five-minutely total power consumption recorded between 01:00 and 04:00 for two sample dwellings, showing refrigeration cycling.

The daily average power consumption of cold appliances was calculated as the average power recorded between 01:00 and 04:00 minus the daily continuous and standby power consumption (as defined by Eq. (3)). There was occasional use of other appliances in the early morning some of which may have high power consumptions (such as kettles or security lights). These can cause an overestimation of the power consumption attributed to the cold appliances. To correct for this, any power consumption greater than 400 W above the calculated daily continuous and standby power was ignored. The level of 400 W was chosen, as it is unlikely that a combination of cold appliances would have total power consumption above this value. The daily cold appliance average power consumption is given by

$$\overline{P}_{\text{COLD}} = \frac{1}{n_{1-4}} \sum P_{1-4} - \overline{P}_{\text{C\&S}}$$
(4)

The average daily electricity consumption of the cold appliances is calculated by assuming that \overline{P}_{COLD} remains constant throughout the day. It is recognised that his approach might lead to a slight underestimate of the cold appliance energy use because the cycling could be more rapid during the day when the door of the appliance is opened and closed and the surrounding air temperature is higher. The latter effect may be less pronounced if the cold appliance is located in a poorly insulated space such as a garage. Previous work has shown that cold appliance energy use may be around 5–10% less in the early morning compared to the whole day [26] but no attempt to correct for this has been made in this work.

4.4. Active appliance energy consumption

The remaining portion of household electricity consumption is accounted for by the active appliances and standby appliances in use. These appliances are difficult to detect individually, using the simple approach to analysis adopted here, as there can be a great variety of different appliances, each with different power demands, and there is often no discernable pattern of use. The daily average power consumption of the active appliances and standby appliance in use (\overline{P}_{ACTIVE}) is given by Eq. (5). The daily average power consumption is used to calculate annual consumption totals for each household.

$$\overline{P}_{\text{ACTIVE}} = \overline{P}_{\text{TOTAL}} - \overline{P}_{\text{C&S}} - \overline{P}_{\text{COLD}}$$
(5)

5. Analysis of electricity consumption trends

5.1. Annual results for the first year of monitoring

The annual electricity consumption totals for each consumption group were calculated for the 72 monitored dwellings. The results for the first year of monitoring are shown in Fig. 7 where each vertical bar represents the results for an individual dwelling. The height of the bars gives the annual total consumption (the electricity consumption of all appliances) and the bars are divided to show the contribution of the three groups: continuous and standby, cold and active. The results are arranged in the order of the annual total consumption and the location of each dwelling is shown by the site number. It is evident that there is a large variation in consumption across the dwellings. For example, the lowest annual total electricity consumption was 902 kWh, consisting of a continuous and standby consumption of 104 kWh, a cold appliance consumption of 236 kWh and an active appliance consumption of 562 kWh. The highest annual total electricity consumption was 7743 kWh, with a continuous and standby consumption of 1993 kWh, a cold appliance consumption of 481 kWh and an active appliance consumption of 5269 kWh. There appears to be no correlation between the dwellings of a particular site and their electricity consumption. The dwellings were split into three energy user groups according to their annual total consumption in the first year of monitoring. The 24 dwellings with the lowest annual total consumption (902-2160 kWh) were assigned to the low energy group, the middle 24 (2174-3247 kWh) to the medium energy group and the highest 24 (3273–7743 kWh) to the high-energy group.

For all dwellings in the first year of monitoring the average total electricity consumption was 3100 kWh (Table 3). This is

lower than the UK Government estimate of average annual electricity consumption of all UK dwellings (4068 kWh in 2004) which reflects perhaps the fact that the monitored dwellings were mostly social housing and so did not contain all types of UK housing (such as large, detached houses). For all the dwellings, the continuous and standby consumption represented 19% of the total consumption, the cold appliance consumption 20% and the active appliance consumption 61%. The proportion of cold appliance consumption matches well with the results from the DECADE project [13] (which estimated the proportion of cold appliance consumption at 18% for 2003). The consumption figures can also be expressed in terms of equivalent continuous power. For example, the dwellings' average annual total consumption of 3100 kWh has an equivalent continuous power of 354 W. The equivalent continuous power is useful when considering the plausibility of the results, in particular for the continuous and standby consumption. The equivalent continuous power for the average continuous and standby consumption was 69 W (equivalent to the combined standby power of several appliances such as televisions, stereos, set-top boxes, desktop computers and cold appliances as given in Table 1). This can be compared to previous work by the EURECO project which gives an average equivalent continuous power of 50 W for 400 EU houses monitored in 2000 [25].

The annual results show that continuous and standby and active appliance consumption were greater in the high-energy group than the low energy group (Table 3). Cold appliance consumption was similar for the low and medium energy groups and higher in the high-energy groups. These relationships were investigated by plotting the continuous and standby, cold appliance and active appliance annual consumptions against annual total consumption for the first year of monitoring (Fig. 8). Linear regression lines were fitted to the data points and, although they do not capture the variation in the results, they do give an indication of the overall trends. Continuous and standby, cold appliance and active appliance consumption all appear to increase as total consumption increases, although cold appliance consumption increases only marginally. This is to be expected as it is likely that dwellings will not have more than one or two refrigeration appliances irrespective of



Fig. 7. Annual total consumption totals per appliance consumption group and dwelling for the first year of monitoring.

Table 3										
Annual	consum	otion	results	for	the	first	year	of	monito	ring

	Annual consum (as % of house	ption of appliance hold consumption)	e categories mea)	n (kW);	Equival	ent continuous po	wer ^a mean (W))
	Total	Continuous and standby	Cold appliance	Active appliance	Total	Continuous and standby	Cold appliance	Active appliance
All dwellings $(n = 72)$	3100 (100%)	601 (19%)	620 (20%)	1879 (61%)	354	69	71	215
Low energy group $(n = 24)$	1770 (100%)	297 (17%)	535 (30%)	938 (53%)	202	34	61	107
Medium energy group $(n = 24)$	2689 (100%)	402 (15%)	577 (21%)	1710 (64%)	307	46	66	195
High-energy group $(n = 24)$	4841 (100%)	1104 (23%)	747 (15%)	2990 (62%)	553	126	85	341

^a Equivalent continuous power is the power consumption which, if it remained constant for a year, would consume an equivalent amount of energy as the annual consumption totals.

Table 4

Electricity consumption statistics for all households (n = 72)

Electricity consumption category	Annual electricity consum (standard deviation) range	ption (kW) mean : minimum to maximum	Paired sa	mples <i>t</i> -tes	t (year 1 to year 2	difference	e)	
	Year 1	Year 2	Mean increase (kW)	Mean increase (%)	95% confidence interval (kW): lower to upper	t value	Significance (two-tailed)	Significance (one-tailed)
Total $(n = 72)$	3100 (1487) 902 to 7743	3241 (1668) 920 to 8775	141	4.5	-6 to 288	1.9	0.060	0.030
Continuous and standby $(n = 72)$	601 (634) 85 to 3375	662 (685) 74 to 3715	61	10.2	-4 to 119	2.1	0.036	0.018
Cold $(n = 72)$ Active $(n = 72)$	620 (272) 118 to 1570 1879 (1052) 333 to 5269	610 (270) 85 to 1464 1968 (1132) 383 to 5254	-9 89	-1.5 4.7	-40 to 21 -18 to 196	0.6 1.7	0.538 0.101	0.269 0.050

occupant numbers, ownership of other appliances or consumption patterns. Both continuous and standby consumption and active appliance consumption increased greatly with the total consumption. In households with low annual total consumption the continuous and standby consumption is lower than the cold appliance consumption. The regression lines in Fig. 8 show that around an annual total consumption of 3000 kWh the continuous and standby consumption becomes, on average, larger than the cold appliance consumption.

5.2. Analysis of electricity consumption trends for all households

The results for all dwellings from the first year of monitoring (year 1) to the second year of monitoring (year 2) were

compared to investigate the trends over time (Table 4). The mean, standard deviation and range (minimum to maximum) were calculated for the total consumption, continuous and standby consumption, cold appliance consumption and active appliance consumption. There was an increase from year 1 to year 2 in the average total consumption from 3100 kWh to 3241 kWh. On average, continuous and standby consumption increased from 601 kWh to 662 kWh and active consumption from 1879 kWh to 1968 kWh. The average cold appliance consumption decreased slightly from 620 kWh to 610 kWh. For each set of results paired sample *t*-tests were applied to the year 1 and year 2 values to test the significance of any change.

Total consumption increased on average by 141 kWh, an increase of 4.5%. The increase in total consumption was caused by the overall increase in continuous and standby consumption



Fig. 8. Total consumption against appliance group consumption for all dwellings in the first year of monitoring.

Table

of 61 kWh (10.2%) and active consumption of 89 kWh (4.7%). The consumption of cold appliances decreased slightly overall by 9 kWh (-1.5%) during the monitoring period. The ownership of cold appliances may have saturated in the households (most households are unlikely to purchase additional cold appliances) and the decrease may be caused by the replacement of cold appliances with higher efficiency models. The *t*-tests showed that the continuous and standby annual increase was significant at the p < 0.05 level if the twotailed p value is used. However, if the one-tailed p value is used (reflecting the hypothesis that, based on current trends, energy consumption would increase from year 1 to year 2) then the increases in total consumption and active consumption can also be considered significant at the 0.05 level.

5.3. Analysis of electricity consumption trends by energy group

The trends in annual consumption totals are investigated further by considering results for the low, medium and highenergy groups separately. For each group descriptive statistics and t-tests were calculated for the total, continuous and standby, cold appliance and active appliance consumption categories for the first and second year of monitoring (Table 5). There were clear differences between the low, medium and high-energy groups. Total average consumption increased overall from 1770 kWh to 1964 kWh (11.0%) for the low energy group and from 4841 kWh to 5088 kWh (5.1%) for the high-energy group. For the medium energy group the total household consumption decreased slightly over the monitoring period from 2689 kWh to 2670 kWh (-0.7%). The increase for the low energy group was significant at the p < 0.05 level using the two-tailed p value. The increase observed in the low and high-energy groups was largely caused by increases in the continuous and standby consumption and active appliance consumption. For the continuous and standby consumption there was a rise from 297 kWh to 375 kWh (26.3%) in the low energy group and a rise from 1104 kWh to 1222 kWh (10.7%) in the high-energy group. The active appliance consumption increased from 938 kWh to 1069 kWh (13.9%) for the low energy group (significant at the p < 0.05 level using a twotailed test) and from 2990 kWh to 3114 kWh (4.2%) for the high-energy group. The decrease in total consumption in the medium energy group was due to a decrease in continuous and standby consumption, from 402 kWh to 389 kWh (-3.1%), and in cold appliance consumption, from 577 kWh to 559 kWh (-3.3%).

6. Discussion

This study has focussed on a relatively small number of dwellings (72), all of which were occupied from 1-3 years before monitoring began and the majority of which were modestly sized social housing. It would not therefore be wise to draw sweeping conclusions from the analysis or to make strong statements concerning policies to reduce the CO₂ emissions in the UK housing stock. The study does however support the

Electricity consumption sta	atistics for all househ	olds by energy group							
Electricity consumption category	Energy group	Annual electricity consumptio (standard deviation) <i>range: m</i>	n (kW) mean inimum to maximum	Paired samp	iles <i>t</i> -test (year	r 1 to year 2 differenc	(əc		
		Year 1	Year 2	Mean increase (kW)	Mean increase (%)	95% confidence interval (kW): lower to upper	t value	Significance (two-tailed)	Significance (one-tailed)
Total household $(n = 72)$	Low	1770 (322) 902 to 2160	1964 (554) 920 to 3447	195	11.0	14 to 376	2.2	0.036	0.018
	Medium High	2689 (319) 2174 to 3247 4841 (1198) 3273 to 7743	2670 (687) 1195 to 4600 5088 (1484) 2994 to 8775	—19 247	-0.7 5.1	-270 to 231 -87 to 582	-0.2 1.5	0.875 0.140	0.438 0.070
Continuous and standby $(n = 72)$	Low	297 (271) 85 to 1265	375 (232) 74 to 1015	78	26.3	-23 to 179	1.6	0.122	0.061
``````````````````````````````````````	Medium High	402 (234) 117 to 1054 1104 (843) 90 to 3375	389 (167) 140 to 814 1222 (936) 114 to 3715	-13 119	-3.1 10.7	-67 to 41 -16 to 253	-0.5 1.8	0.631 0.81	0.316 0.405
Cold $(n = 72)$	Low Medium High	535 (273) 118 to 1137 577 (203) 313 to 975 747 (295) 314 to 1570	521 (265) 85 to 1044 559 (182) 279 to 1051 752 (300) 324 to 1464	-14 -19 4	-2.6 -3.3 0.6	-68 to 40 -75 to 37 -52 to 61	-0.5 -0.7 0.2	0.591 0.496 0.870	0.296 0.248 0.435
Active $(n = 72)$	Low Medium High	938 (304) 333 to 1495 1710 (403) 952 to 2533 2990 (959) 1661 to 5269	1069 (445) 383 to 2212 1722 (659) 548 to 3575 3114 (1024) 1441 to 5254	131 12 124	13.9 0.7 4.2	0 to 262 -199 to 223 -100 to 348	2.1 0.1 1.1	0.050 0.907 0.264	0.025 0.454 0.132

observations of others that there is a growing demand for electricity and that the consumption of appliances that are either continuously on or in standby mode (continuous and standby consumption) is an area that might usefully be addressed to reduce the UK's  $CO_2$  emissions. This is demonstrated firstly because the continuous and standby energy consumed, of which the standby energy serves no useful function, is relatively high (around 19% of the total) for the group of dwellings studied and secondly because it appears to be an area in which consumption is growing (by 10.2% on average over just 2 years in the study).

The total increase in energy consumption of the 72 dwellings was 4.5% in just 2 years. This is rather higher than reported elsewhere, e.g. an increase of 1.2% for households for the nation as a whole between 2001 and 2004 [8]. The difference could well be because the houses are relatively new and the occupants were in the process of furnishing their new homes with new or replacement appliances. It would be constructive to continue the monitoring to assess whether the observed trend continues. Elsewhere within the CaRB project a longitudinal study is being set up which should enable the long-term trends in domestic electrical use to be charted for a sample of houses that is more statistically representative of UK households [32].

This study made use of the monitored whole house electricity consumption data from which trends in the energy consumption groups could be inferred. It is possible that with more sophisticated analysis, perhaps linked to limited individual appliance monitoring, much greater insight into individual active appliance usage (frequency and duration) could be gained; this is being exploited in the CaRB project. From the results available here we can hypothesise that the increase in total consumption, primarily in continuous and standby energy use but also in active appliance use, could be due to either: the presence in the dwellings of more appliances with standby and active modes; the presence of more appliances that are continuously on; the replacement of older products with newer ones that consume more energy in one or other of these modes; or the more frequent use of standby and active appliances. Subjectively one can imagine that any or all of these could be true: many households are purchasing poorly designed IT equipment (modems, printers, scanners, etc.) that are always on and older CRT TVs are being replaced with larger flat screen (LCD or plasma) TVs which incorporate a standby mode and consume more power. Only by linking measured data, such as that used in this paper, with quantitative surveys of appliance ownership can greater insight can be gained and only by linking such studies with qualitative social science research to understand the motivations and drivers for appliance usage, can policies for reducing consumption can be reliably framed. Work of the latter type, which focuses on lighting energy use, has already been started in the CaRB project and will be extended to cover other end uses [33]. A further study aims to collect high frequency data of individual appliance consumption in around 40 homes which, combined with measurements of whole house consumption, will build on the techniques described in this paper.

#### 7. Conclusions

A longitudinal study of electricity consumption in a sample of UK domestic buildings has been carried out which identifies the trends in their appliance energy use. Whole house electric power consumption measurements, recorded on a five-minutely basis for 72 dwellings over a 2-year monitoring period, has been used to demonstrate a series of new analysis techniques to improve understanding of domestic electricity use. The techniques distinguish the consumption of three appliance groups: continuous appliances and standby appliances in standby mode; cold appliances; and active appliances including standby appliances in use. Key conclusions are:

- There is great variation in the annual electricity consumption of the dwellings. Even those dwellings on the same site and with similar built form have notably different annual electricity consumptions. This suggests that built form is not a strong determining factor in household electricity use and instead factors such as number of occupants, number and type of appliances, and occupancy patterns may be more relevant.
- Annual electricity consumption of the dwellings increased from the first to the second year of monitoring, from 3100 kWh to 3241 kWh (4.5%). This result was significant at the p < 0.05 level (using the one-tailed p value) and is illustrative of the trend in rising electricity consumption of the UK housing stock. The contributing factors to this increase were shown to be increases in consumption from continuous, standby and active appliances. Continuous and standby electricity consumption (from continuous appliances and standby appliances in standby mode) increased on average by 10.2% (from 601 kWh to 662 kWh) and active appliance consumption by 4.7% (from 1879 kWh to 1968 kWh). Cold appliances were shown not to have contributed to the overall increase in household electricity consumption: on average a 1.5% decrease (from 620 kWh to 610 kWh) was observed.
- The low and high-energy users were responsible for the overall increase in electricity consumption in the monitored dwellings. The total annual consumption of the low energy group increased by 11% (from 1770 kWh to 1964 kWh) over the monitoring period and the high-energy group by 5.1% (from 4841 kWh to 5088 kWh). The medium energy group reduced consumption slightly by 0.7% (from 2689 kWh to 2670 kWh) during the monitoring period. It was the increase in continuous and standby consumption and active consumption which caused the rise in total consumption in the low and high-energy users.

This work has demonstrated the role of monitoring in understanding the trends in electricity consumption in dwellings and also established the need for qualitative and quantitative studies to explore the factors (technical, sociodemographic and behavioural) which influence these trends. This work is continuing within the CaRB project and will build on the findings presented in this paper.

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