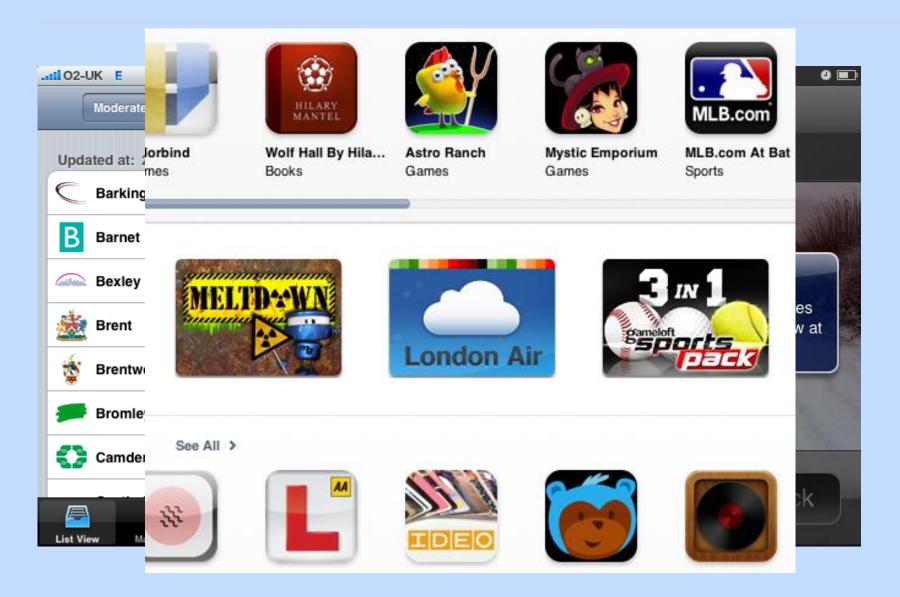


## Canairy app – protecting outdoor workers

Andrew Grieve London Air Quality Network Conference – 25/06/19

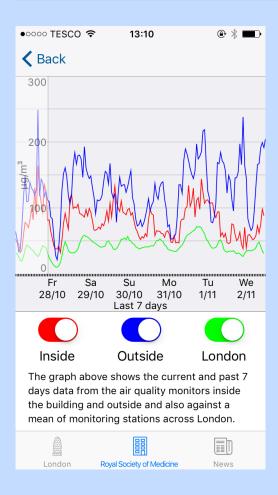
## **London & Sussex Air apps - 2010**

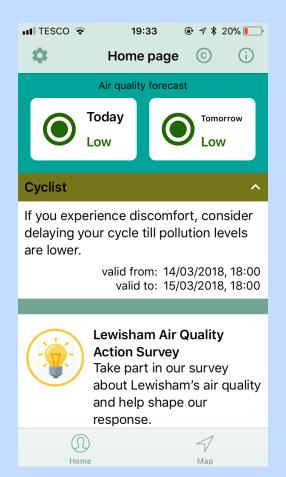


## **CityAir - 2013**



## **Many more...**













# Apps as a research tool

## Apps as a research tool

#### ARTICLES

#### The Asthma Mobile Health Study, a large-sca observational study using ResearchKit

Yu-Feng Yvonne Chan<sup>1,2</sup>, Pei Wang<sup>1</sup>, Linda Rogers<sup>3</sup>, Nicole Tignor<sup>1</sup>, Micol Zweig<sup>1</sup>, Steven ( Nicholas Genes<sup>1,2</sup>, Erick R Scott<sup>1</sup>, Eric Krock<sup>4</sup>, Marcus Badgeley<sup>1</sup>, Ron Edgar<sup>4</sup>, Samantha V Rosalind Wright 3,5,6, Charles A Powell 3, Joel T Dudley 1,7 & Eric E Schadt 1

The feasibility of using mobile health applications to conduct observational clinical studies requires rigor we report initial findings from the Asthma Mobile Health Study, a research study, including recruitment, conducted entirely remotely by smartphone. We achieved secure bidirectional data flow between investig participants from across the United States, including many with severe asthma. Our platform enabled pro longitudinal, multidimensional data (e.g., surveys, devices, geolocation, and air quality) in a subset of us study period. Consistent trending and correlation of interrelated variables support the quality of data obti We detected increased reporting of asthma symptoms in regions affected by heat, pollen, and wildfires. F this technology include selection bias, low retention rates, reporting bias, and data security. These issues realize the full potential of mobile platforms in research and patient care.

Three billion smartphones were in use worldwide in 2015, a figure recruitment; (ii) characteristics of a stud expected to double by 2020 (ref. 1). Smartphones have replaced standand mail and landline phones for many people, creating a need to leverage mobile devices for research historically conducted by phone and mail. Mobile technology may also offer advantages over traditional data collection and management processes in research.

ResearchKit (Apple; Cupertino, CA, USA), an open source framework for mobile research can (1) obtain electronic informed consent. (ii) administer and collect questionnaires, (iii) actively and passively collect biometric data, (iv) provide reminders and notifications, and (v) reliably transmit and secure data in a central repository in compliance with regulatory requirements. Several research institutions and Sage Bionetworks (Seattle) collaborated with Apple to build the first mobile health applications using ResearchKit to demonstrate the feasibility of conducting research via this platform, and to provide an open source template to build third-party research apps2-5. To this end, we developed the Asthma Health Application (AHA) and conducted the Asthma Mobile Health Study (AMHS).

As many as half of the 25 million Americans with asthma lack optimal asthma control, contributing to \$56 billion in annual disease cosis6. A smartphone platform enabling large-scale, continuous collection of clinical, environmental, and passive biometric data may provide valuable insights for asthma research and clinical care. Our prospective observational mobile health study focused on assessing the following primary objectives: (1) feasibility of smartphone-based

the ResearchKit platform; (iii) user engr terns; and (iv) user data sharing prefere and utility of self-reported data collected ing correlation with trusted external sou expected patterns. Lastly, we evaluated t of AHA use in a subset of participants.

Study enrollment, user experience, as After its Apple App Store release on Mar downloaded 49,963 times over the first were from United States. Only US rest study. Figure 1 describes the AHA enro key sub-cohort definitions (see Supplem prehensive description of study sub-coh the geographic distribution of the study p users, out of 8,524 completed the enroll were asked to complete a series of intake comorbidities, and asthma history over enrollment. Participants were also aske surveys to log symptoms, presumed trip; ence for the duration of the study. In addit weekly surveys to capture participants' hi and quality of life over the previous 7 d. E

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Received 15 April 2016; accepted 13 February 2017; published online 13 March 2017; doi:10.1038/nbt.3826

#### ARTICLES

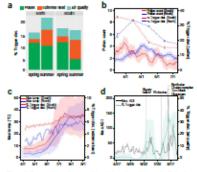


Figure 4 Geographic and seasonal trends in asthma triggers for Robust users. (a) The percentages of users reporting pollen, extreme heat or air quality as an asthma trigger (y axis) for southern (red) and northern (blue) regions of the contiguous US in the spring (March-May) and summer (Jun-Aug) respectively (based on n = 545 Robust users). (b) The percentage of users reporting pollen as an asthma trigger (solid) and the monthly pollen level (dashed) for southern (red) and northern (blue) regions of the US (based on n = 64 Robust users). (c) The percentage of users reporting extreme heat as their asthma triggers in southern and northern US regions for the spring and summer months. (based on n = 545 Robust users). (d) The percentage of users reporting air quality as an asthma trigger for Washington state wildfires (solid, left y axis) and daily PM2.5 concentration (dashed, right-axis) in the same area (based on n = 37 Robust users). In (b-d), the shaded regions represent the ± 1 s.d. interval bands.

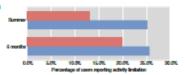
retention patterns, we focused on a subset of 537 users from the Robust user cohort, who were enrolled in the study for more than 90 d and who provided data for all the co-variates considered in the analysis. Both univariate and multivariate survival analyses of these 537 users, found earlier entrance into the study, (hazard ratio = 2.01 (95% CI, 1.73-2.33)) for each month following AHA launch, and increasing age, (hazard ratio = 0.978 (95% CI, 0.969-0.987)) for each additional year, significantly associated with greater likelihood of daily survey participation (Fig. 2d,e, Supplementary Fig. 2a and Supplementary Table 4a,b).

We also investigated the 'individual response rate', defined as the number of days with at least one daily survey question completed divided by the number of days enrolled through September 9, 2015, for each user. For the 537 users considered in the above relention analysis, the average individual response rate was 31%, with 104 of these users having an individual response rate >50% (Supplementary Fig. 2b). Increasing age and earlier study entry month were also associated with higher individual response rate (Supplementary Table 4c).

#### Relationship between baseline asthma control and prospectively collected data

358

Participants completed intake questionnaires assessing asthmacontrol upon study enrollment and then prospectively reported daily and nightly asthma symptoms, quick-relief inhaler usage, controller medicine usage, and peak flow measures over the course of their participation in the study. Patients' daily survey responses for the (n = 235 and n = 173, respectively) (Supplementary Fig. 4).



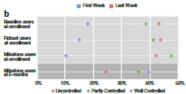




Figure 5 Positive impact of the app on user group. (a) The percentage of users reporting activity-limitation in their first week versus their last week in the summer (top, based on n = 331 Robust users) and in the entire 6-month study period (bottom, based on n = 1,926 Robust users). (b) The percent distribution of GINA control for all cohorts at enrollment (top three) and after 6-months of study participation (bottom). (c) Feedback and Milestone survey results based on data from Milestone users.

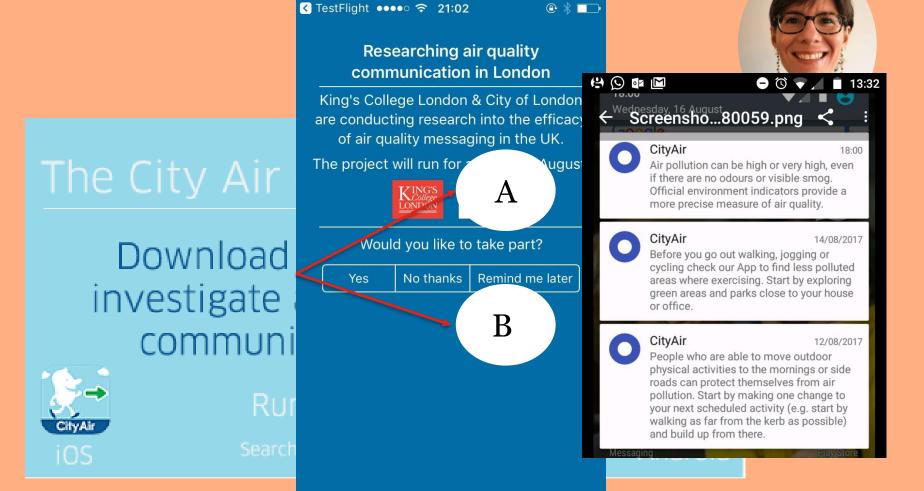
aforementioned four parameters were all found to be significantly associated with the GINA control levels calculated based on intake questionnaires from Robust users reporting daffy (Kruskal-Wallis test: H(2) = 471.94,  $P < 2.2^{-16}$ , n = 2,295) and nightly symptoms (Kruskal-Wallis test; H(2) = 232.23,  $P < 2.2^{-16}$ , n = 2.295), quick-relief inhaler usage (Kruskal-Wallis test; H(2) = 677.12,  $P < 2.2^{-16}$ , n = 2,295), and controller medicine usage (Kruskal-Wallis test; H(2) = 63.73,  $P = 1.4^{-14}$ ,  $\pi = 2,285$ ) (Fig. 3a-d and Supplementary Fig. 3).

Of those in the Robust user cohort, 1,621 voluntarily submitted at least one peak flow measurement during the study period. As expected, patients with well-controlled asthma, and who were male and tall, had higher average peak flows throughout the study period. (Fig. 3e). Those with uncontrolled asthma at baseline reported peak flows 42 liters/min lower than their well-controlled counterpart after adjusting for height and gender (n = 183).

We examined concordance of reported asthma symptoms, rescue inhaler use, and peak flow measurements using time series of daily survey responses from Robust users. Consistent with clinical expectation, we detected a positive correlation between daily or nightly symptoms and rescue inhaler use (n = 979 and n = 761, respectively), whereas these same variables were negatively correlated with peak flow values

# Adherence to preventative recommendations during poor air quality days

# Adherence to preventative recommendations during poor air quality days



# Adherence to preventative recommendations during poor air quality days

Environment International 124 (2019) 216-235



#### Concerns lists available or ScienceDirect

#### **Environment International**

journal homepage: www.elsevier.com/locate/envint

The effect of evidence and theory-based health advice accompanying smartphone air quality alerts on adherence to preventative recommendations during poor air quality days: A randomised controlled trial



Donatella D'Antoni<sup>2-</sup>, Vivian Auyeung<sup>2</sup>, Heather Walton<sup>3-</sup>, Gary W. Fuller<sup>3</sup>, Andrew Grieve<sup>3</sup>, John Weinman<sup>2</sup>

\* Kingh College Lundon, Incidence of Phermatocontrol Science, 150 Securioral Street, London STI RMI, UK

\*Kingh Callege Jumbs, Research Mercech Group, MRC PMC Crobs for Formacient and Health, Notice of Population Health and Research Research States, 1981 Sumpled Street, London STI WILL UK.

\* Material Busines for Books Research Health Proceeders Research Units on Neighburgers of Tereformered Research on King's College London in permansity with Published Services 1997

#### ARTICLE INFO

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#### ABSTRACT

Afternity new alternative an invest angelies injective in terms both, and he have these industrial involved in the part of the EX Alt Coulty before, (IAON) with an alternative message forms, using a 3 (person) population or, or in a manifestation of the EX Alt Coulty before, (IAON) with an alternative message forms, using a 3 (person) population or, or in a manifestation of the Coulty before its consistence of the constraints of the countries o

On the other hand, the fore-consequences is performed sensingly when intentions occur collected metabols to a hypothetical high air positions recovers, with all in ground receiving notwintyly high intentions to change behaviours. This winds expands the currently limited understanding of how to improve the behavioural suspect of exchange air quality acrets.

#### 1. Background

According to estimate from the World Booth Organization released in 2014, in 2012 around 3.7 million people died premainmy is the world as a neutro of exposure to ambient air pollutino (World Harith Organization (WillOL), 2014). Pholings from epidemiological and toxicological executed have highlighted the negative effects of short- and long-term exposure to air pollution on both premature metallicy and

modifility from earthogolineousy disease (for an overview, see (field) and broaden South that sitegie day exposure to irreffice related pollutarity was associated with increased hospitalizations for adult cardiovascular and parellating repairatory problems (should set al., 2016). In the IR, mentioning networks measure the levels of different air pollutants and these measurements are usually provided by the Department for flaviousness, Food 8 Rund Midias (CEPRA) to the form of duty air quality indices

AMERIANNE, IX., King's Orlège Lordon, MIR 1990., Kinond Institute of Intalh Researd, Health Procession Researd, Virt. PHE, Public Health England, DIFFA, Department de Embrannesse, Rod & Saural Andre (MAD); MAY (Caster Index (OM), Capellarity, Application - Petersional Model - Ourresponding surface at King's Codings London, Institute of Namousculosi Sciences, 190 Stanford Street, London SEI OHE, UK. - Front Anthres theoretical Processing Services (APP).

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D. D'Amont et al.

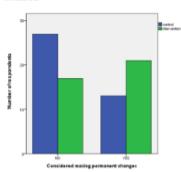


Fig. 3. Proportion of respondents in the control (n=13,32%) and intervention groups (n=21,52%) who considered making permanent changes in their duity travel route and/or correlation from contains. See Table 4.

group) or an alternative behaviourally targeted message format (intervention group). The latter heduled health advice characterized by higher message specificity and axes in conjunction with additional messages targeting specific psychosocial factors found to be associated with higher adherence. Revironment International 124 (2019) 216-22

#### 4.1. Intentions to adhere to advice associated with a hypothetical high air pollution scenario

Our findings showed that the message format did not seem to have an Impact on adherence intentions for the hypothetical high air pollition scenario, are repondents in both centred and intervention groups reported relatively high intentions to follow the advice received. However, it is worth considering that initial high intentions do not necessarily terminate into future behaviour (Webb and Sheeran, 2005).

Our study also showed that respondents in the control group were more willing to wear a mask (which is not a behaviour recommended by the UK DM), compared to the intervention group. Recent evidence suggests that many commercially available masks do not provide adequate preterion (Cherrice et al., 2018). A plausible explanation for these results may be related to the fact that the advice associated with the UK DM) has little message specificity compared to the more destated recommendations provided in the intervention group (which clearly identified appropriate behaviours). This vagaences of recommendation might have led to the intention to adopt behaviours based on participants' personal beliefs rather than the health advice received. The implications of this may be really important depending on what type of not advised behaviour individuals adopt. Future studies aboutd to the advantages of adopting highly specific messages.

#### 4.2. Behaviour changes at 4 weeks

At four weeks, more reapondents in the intervention group were reported to have considered making permanent changes to their daily travel route, carcine location or earrors time compared to the control group. A mediation analysts showed that the variable that mediated this effect was perception of having enough time to follow the health advice received, which was positively affected by the Intervention. In



0.0113.

Fig. 4. Mediation analysis (model 4) showing the mediating effect of perception of time on considering personness behaviorand changes. Multiple mediation model of the intervention (microention vs. control) on the outcome measure. This model sines to kelestify and explain the precessors that underful an observed relationship between an independent variable and a dependent variable through the inclusion of several hypothetical mediator variables (in this case, werry, perceived amosphility), perceived severy, perceived amosphility, perceived severy, perceived amosphility, perceived severy, perceived amosphility, perceived severy, perceived amosphility time to follow the article, belief that taking side reads will make the journey longer, and mensage confinity).

Effect since measures for indirect effects are not available for models with dehotomous concurates. The coefficients reported represent the direct effect, the effect of the independent variable on each mediator (i.e., a pailty) and the effect of each mediator on the dependent variable (by paths) and are standardheet. The values reported in the results section correspond to the indirect effect (i.e., a path  $^*$  b path). All analyses have used 1000 bootstraps.

Significant indirect effects are represented in bold. Baseline measurements were included in the model as covariate and experimental groups coded as: a dummy variable (Control = 0;

"p = 0.0059; ""p = 0.0132; """p = 0.0111;

## Canairy – the app for outdoor workers

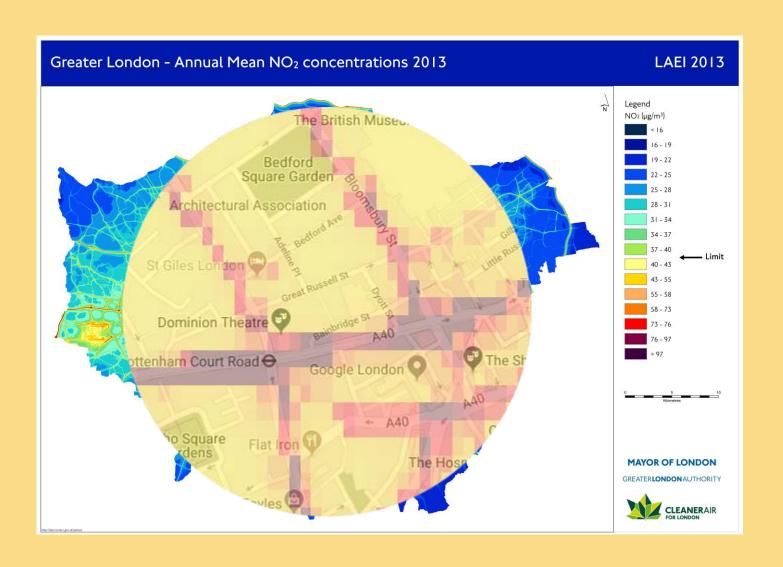


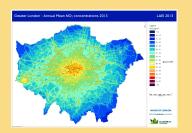


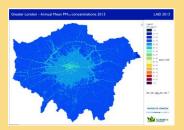


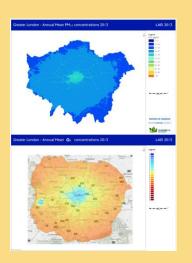
- Build evidence base
- Information & advice for workers
- Intelligence for employers
- Data for BSC and KCL

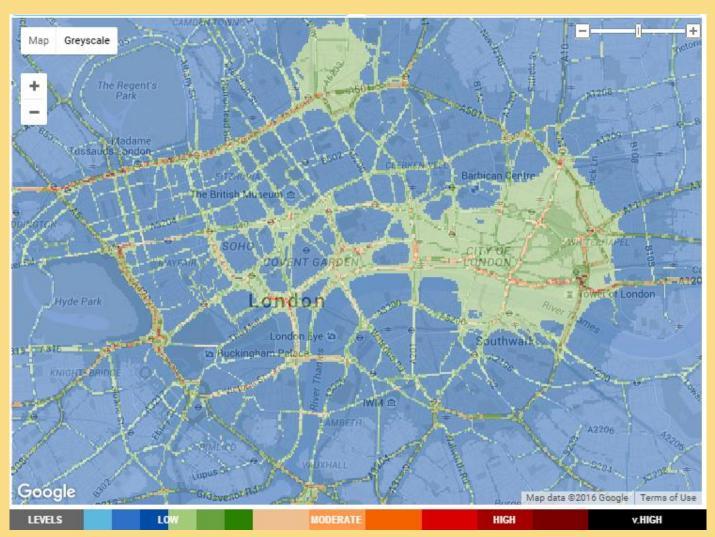


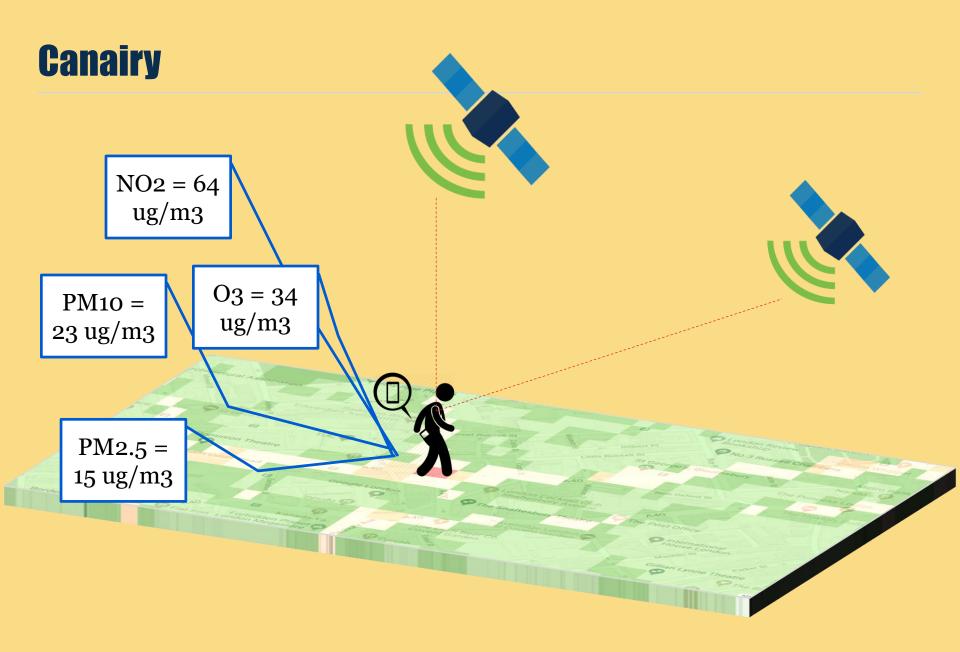












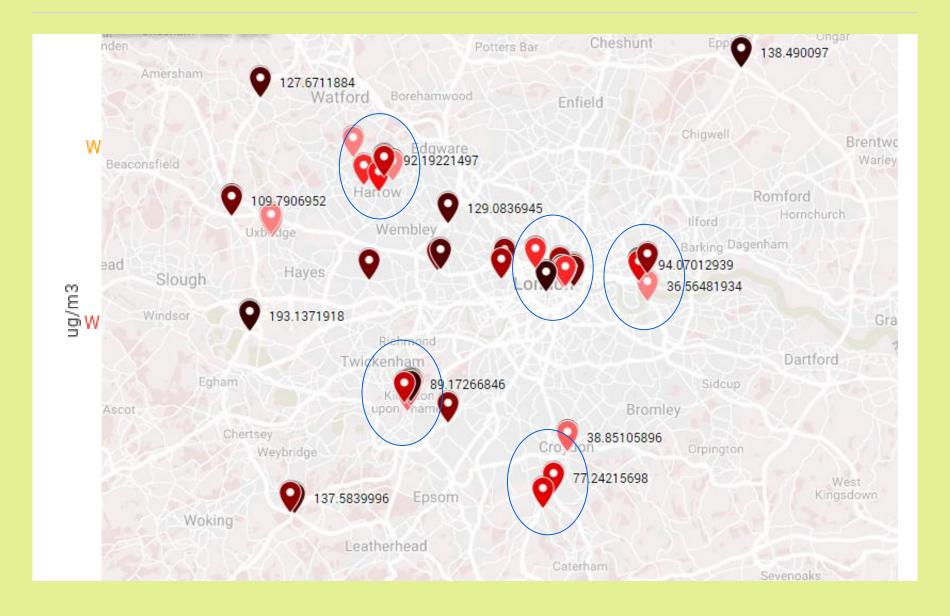


# 30+ Organisations

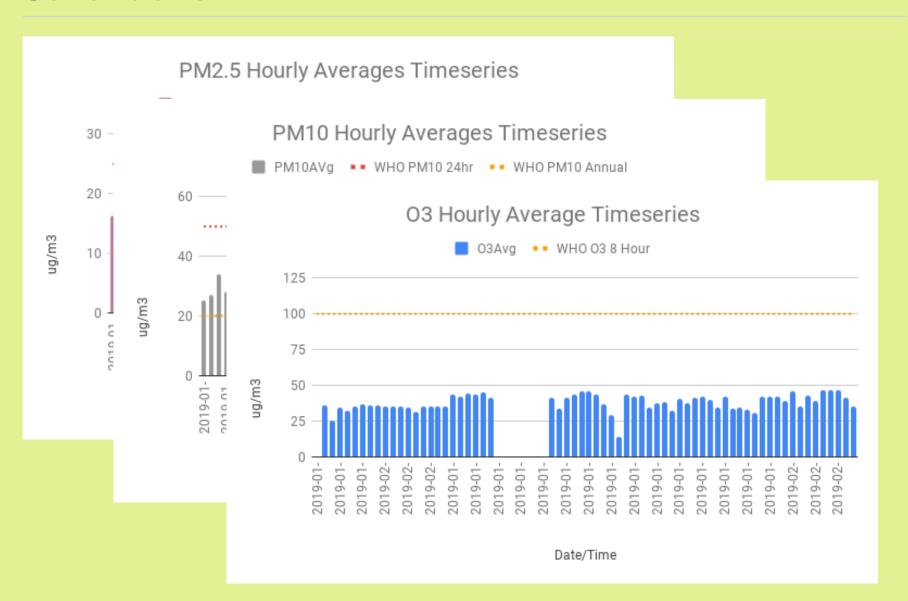


# **Construction Company**

#### **Construction**

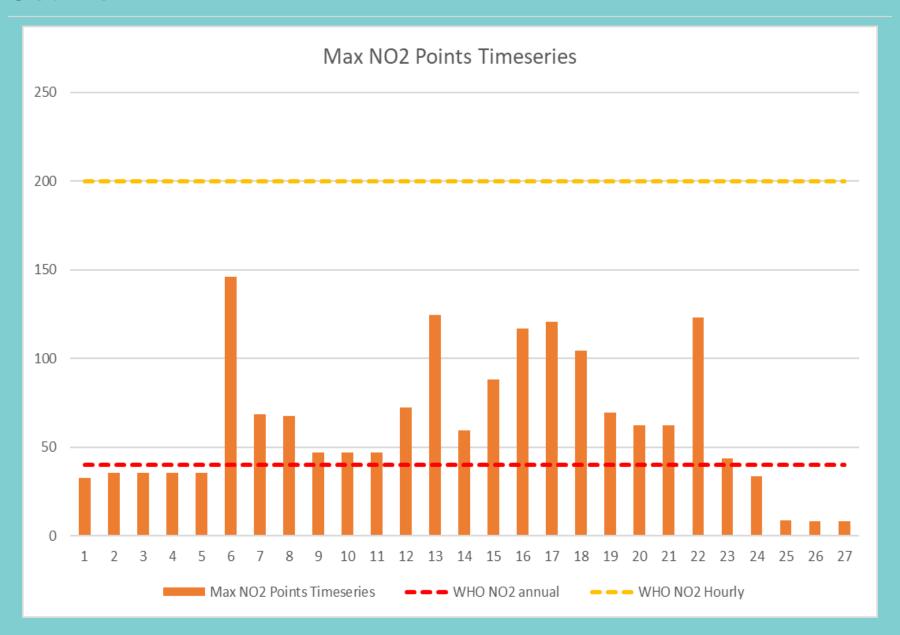


#### **Construction**

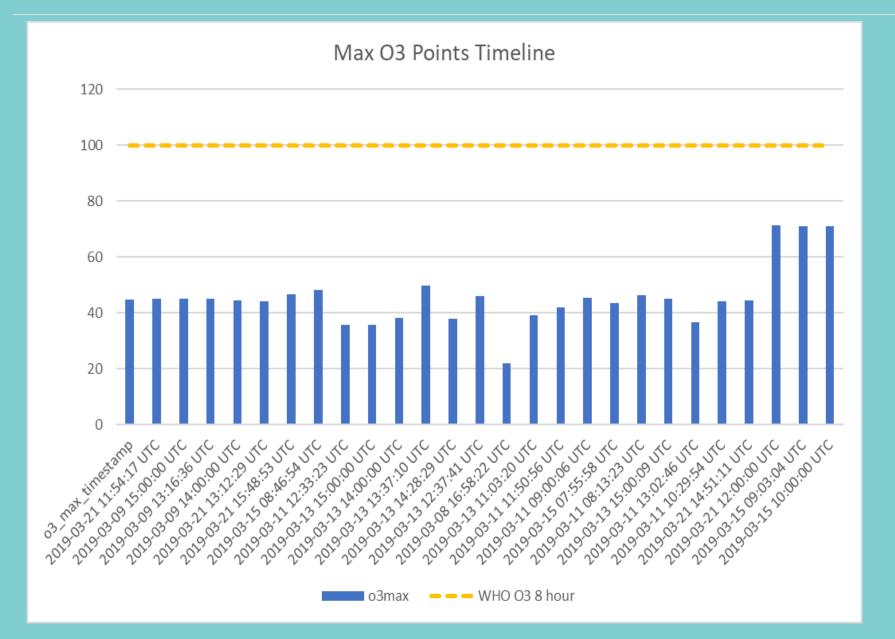


# **Courier Company**

#### **Courier**

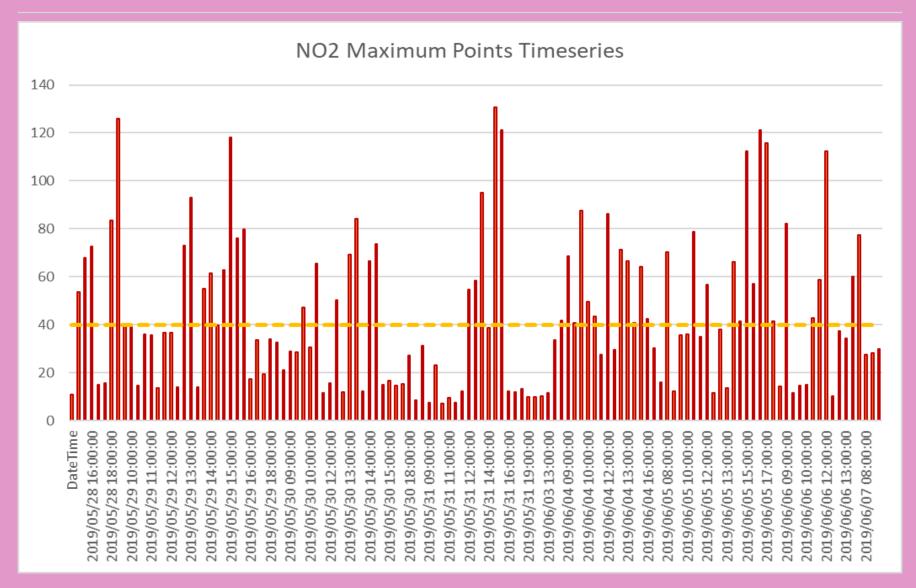


#### Courier

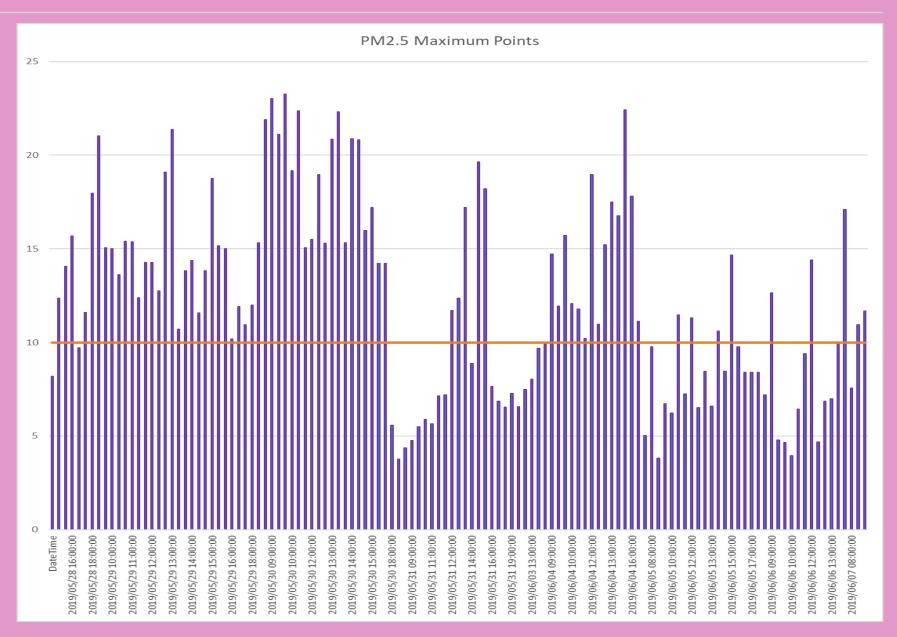


# **Airport**

#### **Airport**



### **Airport**



# Summary

### **Summary**

- New type of data: Pollutant (avg+max) +
  Location + Time + Occupation
- Ability to track exposures over time
- New intelligence for Employees + Employers +
  Campaigners + Researchers
- Limitations: It's modelled data
- Advantages: Able to reach lots of people





# Thank you

**Andrew Grieve** 

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