

Channel Shift - using data analysis to improve service delivery at the City of Edinburgh Council

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Abstract

This doctoral thesis will present the results of my work into the reanimation of lifeless human tissues.

Acknowledgements

Many thanks to my mummy for the numerous packed lunches; and of course to Igor, my faithful lab assistant.

Declaration

I declare that this thesis was composed by myself, that the work contained herein is my own except where explicitly stated otherwise in the text, and that this work has not been submitted for any other degree or professional qualification except as specified.

(Michal Wasilewski)

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Chapter 1

Introduction

Over the last few years, the School of Informatics has been collaborating with the City of Edinburgh Council in the area of open data in initiatives such as the Smart Data Hack and the Council's EdinburghApps hackathons. In the context of Edinburgh Living Lab, this relationship has broadened into investigating other areas of data science, and new kinds of collaboration. My MSc project is taking place within this context, and is focussing on bringing analytic techniques to bear on Customer Relationship Management (CRM) data that has been collected by the Council over the last year.

1.1 Context

As one of the fastest growing local authority areas in Scotland, Edinburgh is facing an ever increasing demand for Council services, outstripping the funds available to meet this demand. There are a number of projects on-going in the Council that try to address the resulting challenges, one of which aims to improve the way that Council interacts with residents, particularly in terms of dealing with complaints and reports of problems. At the moment, citizens can communicate with the Council using multiple 'channels': email, web forms, mobile apps, phone, post and face-to-face conversation. So-called "Channel Shift" is the policy of encouraging residents to use web forms in preference to other communication channels. Some other objectives include informed design of interfaces and web-forms, increase in the use of digital channels and decrease in traditional channels for selected transactions. The Council has been recently building capacity to collect data and use sophisticated tools for managing and integrating it. This project is hoping to contribute to internal resources for extracting business insights from analysing this data. More broadly, I hope that my research will help the Council

to ensure that transactions initiated via digital channels are dealt with effectively, as well as contribute to creating success stories and know-how within the Council.

1.2 Objective of the project

Using analysis of CRM data provide insights about the delivery of CEC services to the residents of Edinburgh. These insights should serve as guidelines for improvement of existing interactions between the Council and citizens as well as help in implementation of transactions for services which are not supported over digital channels yet.

1.3 Thesis structure

The first part of this thesis is devoted to providing a theoretical background to the work undertaken. User Centred Design is a concept in design that has played a major role in building interfaces to computational systems over the last three decades. It is described providing a historical context and modern developments in related fields. Data-driven design is a practice of designing with the use of data driven rather than human driven (ethnographical) methods. Double Diamond methodology is a model of practicing design (conducting design related activities) which is claimed to be describing a universal framework for a design process, not limited to any particular field.

The second part is describing the work undertaken and is divided into 4 phases in accordance to the Double Diamond model.

The last two parts are dedicated to evaluating the project and drawing conclusions.

Chapter 2

Background

2.1 User Centred Design

2.1.1 Introduction to User Centred Design

User Centred Design (UCD) is a broad term that describes both a philosophy and a set of tools used during the design process (Norman and Draper, 1986; Norman, 2013). At its core, it gives central role to the needs and limitations of the user. The level of involvement of the user in the design process may vary, but the fundamental difference compared to other approaches is that decisions are driven by a very deep understanding of users needs (or even by users themselves). It is not limited to interface optimisation and often means working closely with users already at definition stage where they help in the problem identification. Fundamentally, UCD tries to focus on usability throughout the entire development process and further throughout the system life cycle (Gulliksen et al., 2003).

The term User Centred Design was coined and popularized by Donald Normans research group in the 1980s. Two influential books were published in that time which he co-authored: User centered system design (Norman and Draper, 1986) and The psychology of everyday things (Norman, 1988).

User Centred Design is sometimes referred to as User Centred System Design (UCSD). This ambiguity comes from the definition of UCD not being agreed upon for many years (Gulliksen et al., 2003).

Concepts behind UCD did not arise in vacuum. The need for people oriented computers was already recognized in the early days of computers (Ritter et al., 2014; Nickerson, 1969). Voices of concern were raised that product development methods used

at the time were more suitable for big, labour intensive projects and were failing with sophisticated devices which focus on usability (Greenbaum, 1993; Robert, 1965). In 1960s and 1970s there were a number of fields in academia concerned with designing more human friendly devices and processes, but they were applied with varied success. What made UCD so effective was that it focused on the needs of the user, on activity/task analysis as well as a general requirements analysis, carrying out early testing and evaluation, and designing iteratively. (Ritter et al., 2014). It also emphasized the involvement of the user in the design process instead of treating him purely as a consumer of the product. This has been a paradigm shift that was particularly uncomfortable for managers in the United States who were reluctant to hand over the decision making power (Greenbaum, 1993).

UCD has changed over the years. Initially UCD was focused on command-line tools, but as computers got more widespread and their interfaces became more sophisticated, it started growing in importance and played a different role. With Graphical User Interfaces (GUI) it was focused on layouts and optimisation and with nowadays proliferation of computational systems, UCD design is considering things like personal preferences or social and cultural impact of the device (Ritter et al., 2014).

2.1.2 Human Centred Design

Human Centred Design (HCD) is a broader term that puts humans at the centre (Ritter et al., 2014; Earthy et al., 2001; ISO, 1999; Kurosu, 2011). This means taking into consideration the entire context of the situation in which the product will be used and the human aspects of it. It is considered more interdisciplinary than UCD and is described in many standards (Bevan, 2001) such as ISO 13407:1999 (ISO, 1999) and more recently 9241-210: 2010 (DIS, 2009). UCD is considered by some as being too much focused on solving a goal-directed, technological problem and limited by considering people solely as users of the system without looking at the organisational goal or counteracting possible adverse effects of use on human health, safety and performance (Gasson, 2003; Gill, 1996; Bevan, 2001). UCD and HCD are not synonyms and HCD does not necessarily imply using UCD methods (Earthy et al., 2001; Maguire, 2001; Kurosu, 2011; Ritter et al., 2014).

2.1.3 Design Driven Innovation

A recent perspective that is broadening the definition of design to include a reconstructionist (Chan and Mauborgne, 2005) or social-constructionist (Prahalad and Ramaswamy, 2000) view of the market is Design Driven Innovation (Liem and Sanders, 2011; Verganti, 2013).

In his book *Design driven innovation: changing the rules of competition by radically innovating what things mean* Roberto Verganti introduces the concept of Design Driven Innovation (Verganti, 2013). In his opinion, most organisations understand and use design in two ways: making things beautiful and stylish and having a profound (and thus accurate) understanding of user needs. Innovations coming from these two, beauty of the product and user needs (which is an embodiment of User Centred Design), are in his opinion insufficient for market differentiation and have become so common that they are a norm rather than exception. Verganti argues that what is needed (together with the first two) is a third use for design which is a radical innovation in meaning.

His research reveals that recent management literature focuses on technological innovation and what effect it has on an industry. What is also very well covered is looking beyond features and understanding the meanings behind them - what emotions drive people to buy products. However, the silent assumption is, he continues, that meanings are not a subject of innovation. He proposes a third strategy for design which is innovation in what meaning things can carry.

The author brings and analyses dozens of examples to help better understand design-driven innovation such as:

- Artemide, Italian lamp manufacturer, created a lamp that is no longer a source of light, but an object that has influence on peoples mood. Effectively, by providing a device that can change intensity and colour of the light you are enabling people to control their mood and the product becomes an element of well-being.
- The MP3 players were present before iTunes, but it was a change in how to think about music brought by Steve Jobs that revolutionised the industry. Many executives and lobbying groups stubbornly focused on enforcing copy-protection, whereas Apple enabled users to buy a single song instead of an entire album, taste and mix music, create personal playlists.
- Anthropomorphism in the shape of kitchen appliances brought by Alessi, turned equipment into objects of affection, things you bond with, teddy bears for adults

(Verganti, 2013).

- Apples move to release a notebook without an optical drive was considered a bold one, but Steve Job had an understanding of what cloud computing and wireless connectivity meant constant access to vast amounts of data and thus no use for CDs/DVDs.

The author also provides a structured framework for thinking about innovation in meaning and deploying it in an organisation. Design Driven Innovation extends beyond User Centred Design, but does not discredit it.

2.2 Data-driven design

Data-driven design is an emerging field of study that gained popularity with the digitization of our world and in particular with what is known as big data. The premise of data-driven design is an additional layer of perception provided by data collection and processing, previously unavailable to humans. Although the practices of data-driven design are far from being well established, more and more voices are being raised that consider it a very viable tool when used properly with other methods (Neirotti et al., 2014).

2.2.1 What would a cup say if it could speak?

Data can be used to drive the design of many things. Common areas of use of data-driven design in Informatics include websites (web analytics) or mobile apps. A designer can change the layout of a website and in real time analyse what impact on the behaviour of the user it has (CSIRO, 2015a).

However, computational systems are being used for much more than just reading websites. Vizie is a tool analysing social media feeds and it is able to inform government institutions about a failure of a service, provide situational awareness in emergencies or simply help being in touch with citizens by informing about major topics of the day (CSIRO, 2015b). In one case, social media is actually the main, preferred way of communicating with a government institution for better or for worse (MIT Media Lab, 2015).

The Internet of Things (IoT) is another case of digitization entering our lives. We are instrumenting objects in our surroundings giving them a voice. IoT devices will

generate a lot of data about their users and the devices themselves. Vessyl is an IoT cup designed to be part of a bigger health and wellness ecosystem. It traces the nutritional value of liquids consumed by the user (Mark One, 2014). Interesting questions arise from the designers perspective with the emergence of such devices. What impact on the design of the cup do the consumption habits of its users have? If the cup could capture detailed data about its usage patterns location, acceleration, angle of tilt could it suggest a better design (e.g. thinner, taller, rounded edges)? Maybe the cup would tell us something else, unrelated to the drink, something that we cannot think of simply because we are humans?

This vast amount of data captured in different areas of peoples lives provides a lot of opportunities for generating design insights. It is important to stress that having data by itself is not sufficient. It is what follows data analysis that makes all the difference and that is where uncharted territories are.

2.2.1.1 What is big data?

There are many definitions of what Big Data is and in some cases not only do they differ, but even stand in contradiction. This might be due to the fact that early cases of use of the term happened in different fields (Demchenko et al., 2014; Ward and Barker, 2013). Most commonly, Big Data is associated with data storage and data analysis, which in themselves are not new concepts at all. A description that is widely accepted as fundamental in coining the term Big Data is the 3 Vs definition provided by Gartner in 2001 (Douglas, 2001; Ward and Barker, 2013). Since then, the Vs description has been used and expanded (to 5 Vs) by many (McAfee and Brynjolfsson, 2012; Minelli et al., 2012; Demchenko et al., 2014; NIST, 2015).

The 5Vs of big data are as follows:

- **Volume** 90% of worlds data was generated over the last 2 years; by some, big data is considered when dealing with volumes over peta bytes (10^{15})
- **Velocity** more data being received than can be processed using traditional data analysis approach; you receive more information than you can process before a decision has to be made; processing of real-time data streams is becoming essential
- **Variety** different types of data are being accessible (structured data, sensory data, social media data, voice recordings, photos, videos)

- Veracity (validity) lack of control over quality and accuracy which leads to inconsistencies and incompleteness
- Value how to get value out of data

2.2.2 Data Analysis

2.2.2.1 Artificial Intelligence

The proliferation of Artificial Intelligence has changed the landscape of many fields in science.

Genetic Algorithms (GA) are one example of it. In some cases, they can give remarkable results outperforming humans. In one experiment, which was trying to optimise the design of an integrated circuit, GA generated solution which was much better than the one created by humans (Harvey et al., 1997). At the current level of complexity, chips are not designed by humans placing transistors one by one. Instead, humans describe the desired logical functions which are then translated by (sub-optimal) algorithms into a mask work. What was done in the experiment in Sussex, was to skip the entire process altogether and using GA holistically promote chips which were more desirable. This was achieved by either keeping a design for the next iteration or removing it based on specific criteria. The result was a very difficult to understand design there were gates that seemed to do nothing, but when removed the behaviour of the entire chip changed (Harvey et al., 1997). Moreover, it used fewer resources (transistors) and made use of the grey states (undefined states experienced in an integrated circuit immediately after a clock signal, when a transistor is switching from one state to another). GA are mostly used for optimisation purposes.

Fields of AI that are more often used for data analysis include Machine Learning (ML) and Pattern Recognition (PR) (Bishop, 2006). They have many uses with structured and unstructured data. Some of the those relevant in this context include: text/speech recognition, customer choices analysis, usage patterns analysis, decision support systems involving judgment, load forecasting, marketing and sales (Witten and Frank, 2005).

2.2.2.2 Business Intelligence

The term Business Intelligence (BI) has been coined by Howard Dresner from Gartner Group in 1989. It describes a set of data-driven tools (tools that use data analysis

in their workings) and practices that emerged from Decision Support Systems (DSS) which went through a time of intense development in 1980s (Power, 2008). BI has been a very popular and dynamic field in the last few years which is attributed to, among many others, more turbulent business environments and higher demands for profitability (Sacu and Spruit, 2010; Power, 2008; Baars and Kemper, 2008). A range of BI tools that are becoming popular recently are the user-driven solutions which promote self-service as opposed to dependence on IT departments involvement (IBM, 2015a; Qlik, 2015; Microsoft, 2015; Imhoff and White, 2011).

The goal of BI is to unveil valid risks and performance indicators, through the means of interpretation (processing) of large volumes of data, in order to support managers on all levels: strategic, tactical and operational (Baars and Kemper, 2008).

There are numerous models describing BI maturity. In general, they take into consideration the following concepts: deployment, use and impact of BI in an organisation (Lahrmann et al., 2011).

Currently most widely used tools within BI are reporting, data mining and On-line Analytical Processing (OLAP). In many areas this is insufficient as a lot of data is not numerical or otherwise referred to as unstructured, e.g. voice transcripts, comments, e-mails, documents. This is especially true for analysing data about interactions with customers such as data from Customer Relationship Management (CRM) systems (Baars and Kemper, 2008). There are different approaches and frameworks for building systems that incorporate both data types. In general, they can either process unstructured data to extract from it information in a more structured way (e.g. text processing), present both data types next to each other without processing unstructured data (e.g. show all e-mails relevant to a performance indicator to allow human to understand the situation) or anything in between.

2.2.3 Smart Cities

Smart Cities (SC) try to improve the lives of citizens by creating more sustainable and more efficient urban environment for people to live in (Geertman et al., 2015). Using technology-based solutions they try to address some of the challenges faced by metropolitan areas (Neirotti et al., 2014). Although there is no clear definition yet of what a SC is, it is widely accepted that Information and Communications Technologies (ICT) play a major role in SC by acting as their nervous system (Neirotti et al., 2014; Geertman et al., 2015). However, ICT capabilities by themselves are not sufficient and

have to be matched with adequate human and organisational capital in order to enable cities to act accordingly. Some research suggest that globally, initiatives within SC are highly diverse and depend heavily on the cultural and socio-economic background of the geographical region making it non trivial to find commonalities, but with time a few archetype models will emerge (Neirotti et al., 2014; Geertman et al., 2015). The highest number of initiatives in area of SC has been observed in Natural resources and energy and Transport and mobility (Neirotti et al., 2014).

Transportation in Nairobi, Kenya using semi-formal mini-buses has been a subject of a project that used GPS data to improve route planning and way finding (Klopp et al., 2015). The location data was not acquired through telecommunications operators, but was willingly shared by users via a smartphone app. It was made public in GTFS format and processed using open-source tools such as Open Trip Planner (Klopp et al., 2015). It is an example of bottom-up approach in which citizens are empowered (Open Data) and supported by local authorities to act and improve their city (Neirotti et al., 2014).

In 2012 the New York City Council has approved a law requiring all city agencies to open their data by 2018. One of the agencies helping in this process is Mayors Office of Data Analytics (MODA). MODA is responsible for initiatives within five categories: Supporting Operations, Citywide Data Sharing, Disaster Response and Resiliency, Economic Development, Open Data. They are offering courses to other City government employees about data and tools available to them and are also promoting data driven decision making (NYC MODA, 2014). One interesting project in New York City is called Hudson Yards Redevelopment Project in which an entire part of the city will be built from scratch. It will be collecting information about air quality, pedestrian traffic, energy production and consumption. It will have a trash-disposal system to remove waste via underground pneumatic tubes.

2.3 Double Diamond

Double Diamond is a model of the design process developed by the UK Design Council (Design Council, 2007, 2005). It is a result of a qualitative study of practices in companies focused on innovation and it describes the commonalities in the creative activities that can be observed among designers regardless of the field they are working in. The model divides the design process into 4 phases as pictured in the diagram below. Each of those phases is focused on a different objective and involves methods

which are characteristic to that stage.

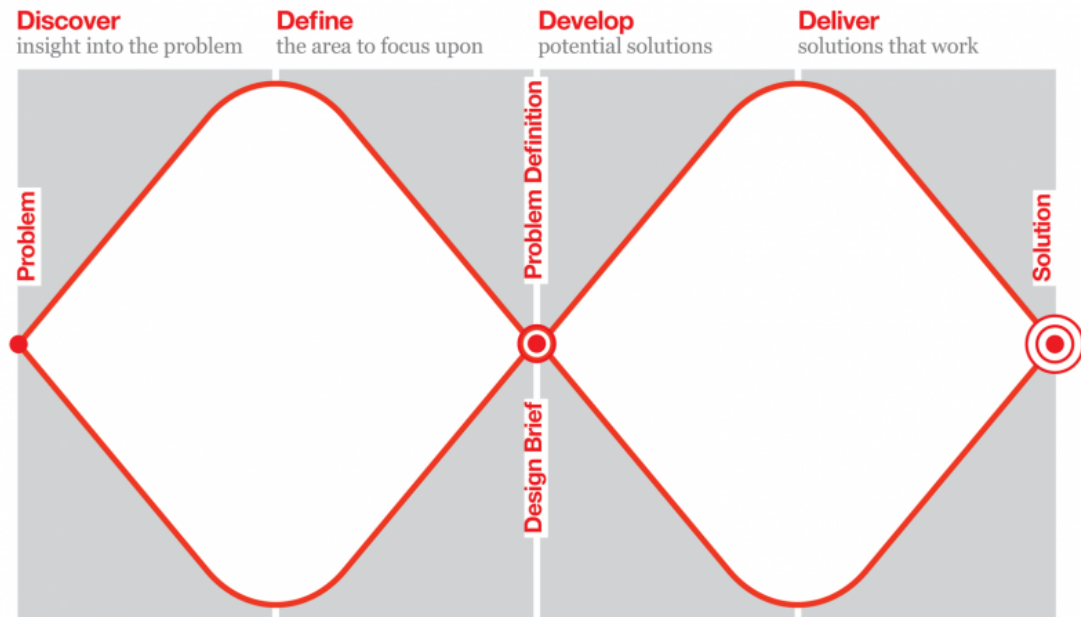


Figure 2.1: Double Diamond model (Design Council, 2005)

2.3.1 Discover

At this stage the attitude adopted is of openness in terms of thoughts and ideas. All ideas are welcome, different perspectives are nurtured and every direction has the potential to be valid. This thinking is typical at the beginning of the project. Designers try to remain as open as possible so that their own perspectives do not limit creativity. This helps in noticing things that might matter, clues about what would make the situation better especially that it might be something unexpected or not identified.

Some of the activities used at this stage include:

- Observation
- User diaries
- Being your users
- Brainstorming
- Choosing a sample
- Quantitative surveys

- Fast visualisation
- Secondary research
- Hopes and fears
- Market research
- User research
- Managing information
- Design research groups

2.3.2 Define

Second phase is trying to make sense out of all the information collected. It is focused on identifying causalities, narrowing down insights and establishing the main challenge which will be addressed. It takes into consideration limitations of the project in terms of what is feasible given the time and resources. Selection and discarding of ideas takes place here as well. It starts with numerous concepts and ideas and finishes with a clear definition of the problem and a list of actionable tasks.

Activities at this stage often involve:

- Focus groups
- Assessment criteria
- Comparing notes
- Drivers and hurdles
- Customer journey mapping
- Project development
- Project management
- Project sign-off

2.3.3 Develop

This stage involves intense creation, prototyping and testing. It takes the results of the previous phase as a design brief and uses it as a framework for the development process. Iterating is very important in order to improve and refine the prototypes as well as concepts. Attitude of trying and failing ensures the space for testing different implementations using different techniques and thus finding the best one. Some of the tools used are similar to Define stage, but here they are focused on bringing a product ready for production.

Typical to this stage are:

- Character profiles
- Scenarios
- Role-playing
- Service blueprints
- Physical prototyping
- Multi-disciplinary working
- Visual management
- Development methods
- Testing

2.3.4 Deliver

The last phase is when the product is being finalised, produced and launched. Here it is mass produced, checked before release and delivered to the user. Feedback mechanisms should be in place which will improve the product itself, but also methods and practices used in the process of creation of it.

Characteristic to this phase are the following activities:

- Phasing
- Final testing
- Evaluation

- Feedback loops
- Methods banks
- Approval
- Launch
- Targets

Chapter 3

Description of the work undertaken

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3.1 Discover

During the discovery phase of the project the objective was to become familiar with the CEC environment, i.e. find out what tools are available and how they are being used and gather information about how to best contribute to the organisation. This was to be done while staying as open as possible, allowing any influences or ideas.

At the beginning of the project I had no knowledge about the operations within the Council or which departments would be involved. Some of the questions I wanted to answer included:

- Are there any activities in the Council similar to the scope of the project (or were there any in the past)?
- Who would benefit from it and how to give those stakeholders an opportunity to be involved?
- What questions (in terms of channel shift) are not answered in the Council? At what level of abstraction should the analysis be conducted?
- What IT systems/tools can be used in the project?
- Who has the necessary understanding of the infrastructure and activities on the architectural level?
- What else do I not know?

3.1.1 Meetings at the Council

Initially the contact person from the Council was Sally Kerr. In response to my questions she arranged a meeting with an enterprise architect Neil Dumbleton. The purpose of the meeting was to give me an opportunity to ask questions regarding organisational structure as well as context of the project.

As it turned out, it was a first meeting in a series. There was no formalised documentation or central place with knowledge about on-going projects that was made available to the author. As a result, personal meetings were the only way to understand activity in the Council. Moreover, it was only thanks to good will of many employees at the City of Edinburgh Council that this was possible.

The diagram below shows all the people who I interacted with during the entire project. Connections between different actors represent how I got to know them.

Circles with coloured backgrounds highlight people who I spoke with in this phase. Orange colour marks people related with University of Edinburgh, blue is for CEC employees. Level of a circle does not reflect a position in the Councils structure - it is used solely for increasing legibility of the diagram.

From these meetings and discussions I gained a brief understanding of the situation at CEC. There was a big effort within the Council aiming at transforming the way services are being delivered and Channel Shift was a part of it. The outsourced ICT services in the Council were delivered by British Telecom starting from 2001 and the contract was set to end in 2016. In order to find a new service provider under revised conditions, a public tender was being held during the writing of this thesis. It considered Channel Shift as one of the significant enhancements of the Councils operations. Final report suggesting the best bidder was submitted by the Finance and Resources Committee on third of August 2015 (Finance and Resources Committee, 2016).

In summer 2014 a new CRM system was introduced called Oracle RightNow. It was replacing the old system called Capture. The deployment was part of the transformation. The system was used to capture information about all interactions with citizens and in some cases it meant that entries did not have all the values specified (due to the nature of an inquiry). The incompleteness of entries did not make them useless as they could still inform about things like level of use. The data captured has not been analysed from the angle described in this project (socio-economic insights) and it was confirmed that such analysis would be useful for the Council.

The transformation within the Council was also trying to centralise Business Intelligence capabilities. The BI department had a number of responsibilities and systems. One of those systems was called IBM Cognos. It was fully operational and a number of reports were generated and delivered to other stakeholders. However, the scale of deployment was still unclear and many departments were still figuring out the role the system would play in their operations. Many services required more digitisation and given the strategy, they could potentially use Cognos in the process. CRM data was an example of a dataset that was promising in providing valuable business insights.

Considering the above, the project would develop a piece of work that would increase know-how within the Council (in terms of using data analysis for designing services and interfaces), provide a case study and directly deliver business value to the organisation. The tools and datasets that could be used are described in the following sections.

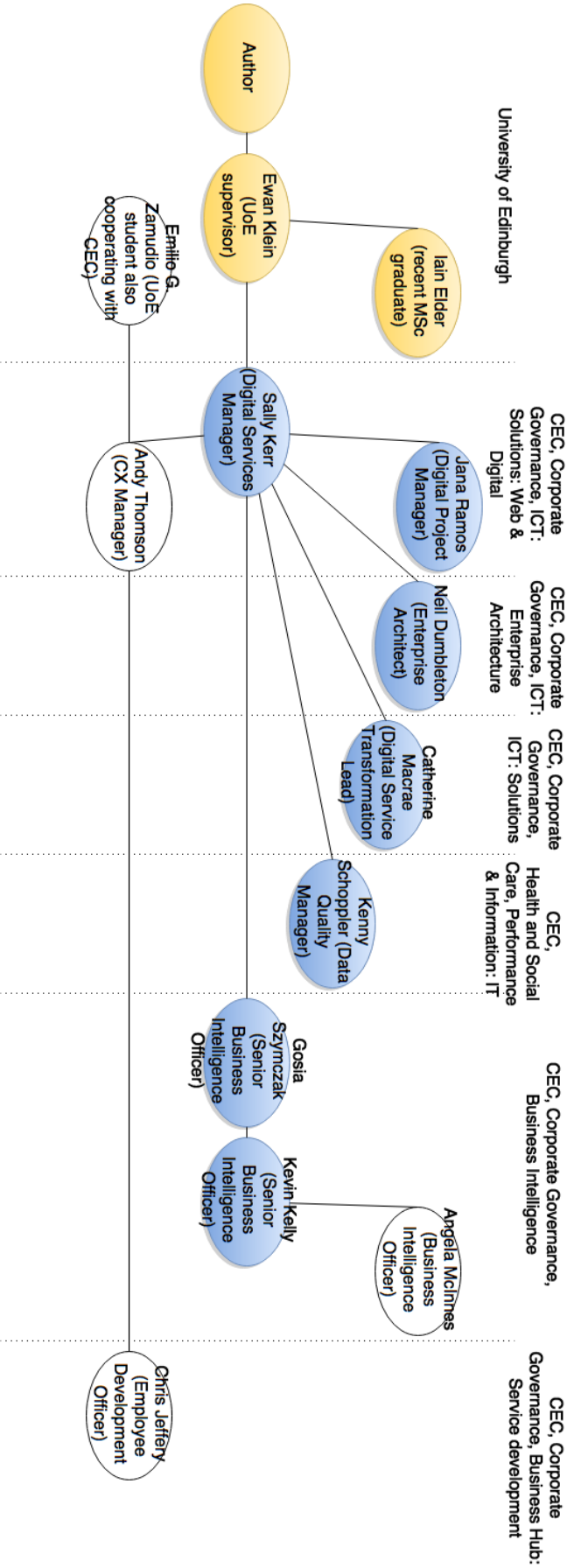


Figure 3.1: CEC employees involved in the project.

3.1.2 CRM data

The new system used at the Council was called RightNow and was provided by Oracle. It was a cloud service and the data in the system was available to CEC employees after registration (with staff number) and installation of the interface. The database consisted of a number of tables, e.g. Answers which was a knowledge base for consultants. The table used in the project was Incidents and it contained information about transactions initiated by citizens (issues reported by them through all channels). This choice was dictated by the scope of the project - de facto by preferences of the clients who were interested in better understanding of the usage patterns of citizens.

Unique Property Reference Number (UPRN) is a number uniquely identifying a household in Edinburgh and thus a person (or a family). Incidents table had a column named UPRN which provided information about who reported the issue. The Mosaic personas (introduced in the next section) were also using UPRN making it possible to link the two datasets. The table had dozens of columns containing information about things like channel used to report the issue, postcode where it was reported, date, Service Level Agreement (SLA).

The incidents table selected for this project (which is a part of the CRM database) apart from storing detailed information on issues reported by citizens provides means for tracking activity across different channels. Some enquires are just general questions and as a result, many entries do not have all values filled in. This enriches the dataset giving a fuller picture of what is happening, i.e. keeping a trace of all enquires.

3.1.3 Mosaic UK Consumer and Demographic data

Mosaic is a dataset created by Experian - credit reference agency. It provides insights about lifestyles and preferences of people across the United Kingdom. It identifies 14 social groups and a total of 57 types within those groups. It was built using more than 450 data variables and the sources include, but are not limited to (Experian, 2014):

- Census
- Open Data
- OFCOM Broadband speeds
- Higher Education Statistics Authority (HESA)

- Electoral Roll
- Council Tax property valuations
- YouGovs survey of consumers and their financial behaviour
- British Crime Survey

It is highly detailed (e.g. food a person buys based on information from retailers) and granular (every household). It can be used as a numerical dataset (Cognos package) or a descriptive interpretation (Segmentation portal).

Since the portal is very useful in working with Mosaic data, after a recommendation from the author access was granted to Andy Thomson (one of the receivers of the reports).

Some of the information about a household available in Mosaic includes:

- Age of members of the household
- Income
- Spending structure
- Property type
- Contact channel preference
- Education
- Access to technology

For example, selected characteristics of group D, referred to as Rural Reality, include: rural locations, village and outlying houses, agricultural employment, affordable value homes, slow Internet speeds. People in this group are aged 66+, they have income of 20k- 29k, they live alone (or in pseudo families) and compared to the rest of the population are less likely to have children. They live in bungalows, named buildings or semidetached households in majority owned by them. Comparing to the rest of the population in the UK, they are half as likely to prefer being contacted via mobile call (in contrary to a landline). Majority of them use pay as you go tariffs with mobile bill of 10 pounds or less, they read regional papers and are very likely to do groceries in Co-op and very unlikely to buy in Waitrose. Much bigger part of this group (compared to other groups in the UK) is likely to use e-mail monthly and not listen to music using mobile technologies.



Figure 3.2: Segmentation portal visualising Mosaic data (Experian, 2014).

3.1.4 IBM Cognos

3.1.4.1 Introduction

Addressing the need of businesses for software helping to achieve a competitive advantage, IBM has a rich portfolio of analytics products. These include solutions in areas of predictive analytics, risk analytics, prescriptive analytics, enterprise performance management and business intelligence (IBM, 2015b). Majority of IBM products in BI belong to Cognos family and include very specialized applications like Cognos Supply Chain Performance Procurement Analytics as well as general purpose tools like Cognos Business Intelligence.

The solution used at CEC is IBM Cognos Business Intelligence 10.2.1 and it is a set of tools that significantly eases processes such as importing data from different formats (e.g. csv, xml, xlsx), combining relational and multidimensional data, generating reports (real time reports, drag-and-drop GUI, database queries in SQL and OLAP), scheduling and redistributing reports, publishing reports on multiple platforms and many more. Tools available at the CEC include: Report Studio, Query Studio, Analysis Studio.

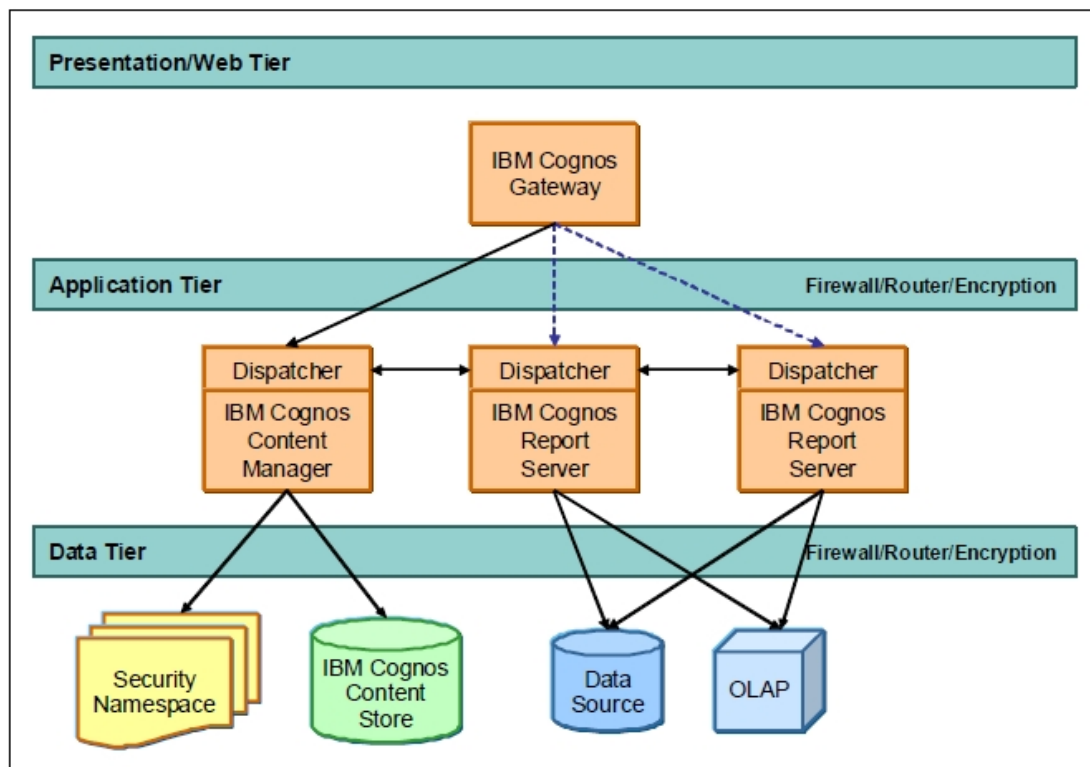


Figure 3.3: IBM Cognos BI architecture (Browne et al., 2010)

The same results can be achieved using different tools, but some of them are better fitted for a specific purpose. Report Studio was designed with reports creation in mind, Query Studio was optimized for creating and editing complex database queries. CEC has two types of instances of IBM Cognos production and development machines, accessible under different URLs.

IBM Cognos BI is an enterprise class SOA platform (Browne et al., 2010). Its n-tiered architecture is made up of:

- The web tier provides user sessions connectivity to applications
- The application tier load balancing and processing of requests, managing storage of customer application data
- The data tier

The platform operates by using different services which are run at those three levels (Browne et al., 2010), for example:

- Agent service responsible for running agents, determines which tasks to execute and forwards those tasks to the monitor service for execution

- Monitor service handles requests which will be run in the background including background tasks, reports scheduled to be run and e-mailed, jobs
- Query service manages Dynamic Query Mode requests and returns the results to the requesting batch

Selected alternatives to IBM Cognos BI:

- Qlik <http://global.qlik.com/uk>
- CAFE cognos analysis for Excel
- Tableau <http://www.tableau.com/>

3.1.4.2 Working with IBM Cognos BI

IBM Cognos can be accessed using either a web interface called IBM Cognos Connection or a Windows application. For the purpose of this project only web interface was used.

The URL for accessing the development instance of IBM Cognos Connection is:
<http://c-cog-dev-app-1/ibmcognos/>

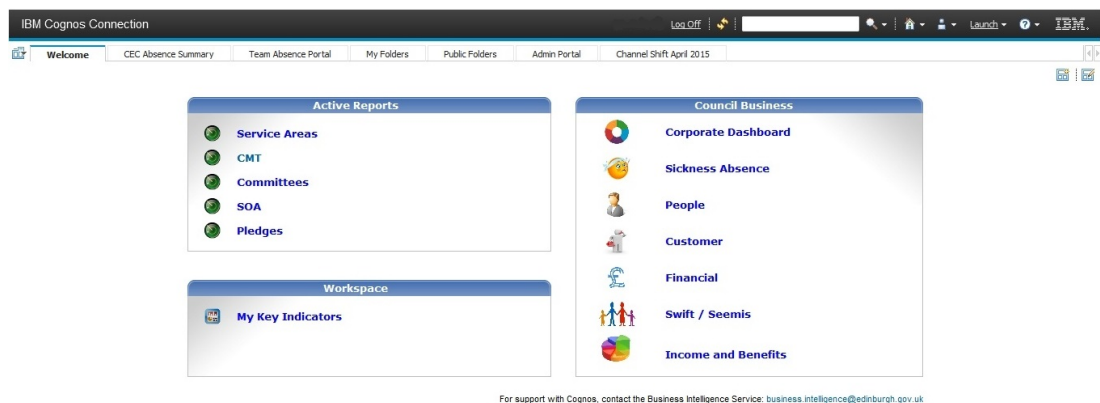


Figure 3.4: Welcome page of IBM Cognos Connection 10.2.1 (web interface to the entire package)

From this welcome page you can start applications available within your license, e.g. Report Studio. The first step after starting Report Studio is selection of the data package that will be used.

After selecting the data package, one can either open an existing report or start creating a new one. In the latter case, a number of templates are available.

The following figure shows Report Studio with a blank report and Mosaic data loaded.

Graphic User Interface (GUI) makes the entire process quick and easy, but it is used to set the general structure of the report. The specifics of the report, e.g. how to filter data, have to be implemented using queries.

Example of a single SQL query (filter):

```
if ([No of interactions with CEC] > 3) then ( 'above 3') else ('up to 3')
```

Example of a counter:

```
count(rows for [MW].[MW].[Date Created], [MW].[MW].[UPRN], [MW].[MW].[
    Subject])
```

Example of the SQL query used to generate an entire report (the entire report can be exported to an XML format as well):

```
select
    MW."Creation Source" as Creation_Source,
    MW."Group" as Group2,
    MW."Date Created" as Date_Created,
    MW."Reference #" as Reference__,
    MW.Subject as Subject,
    MW."Product Hierarchy" as Product_Hierarchy,
    MW.UPRN as UPRN,
    XCOUNT(MW."Reference #" at MW.UPRN,MW."Reference #" for MW.UPRN )
        as No_of_interactions_with_CEC,
    D_MosaicGroupType.GroupTypeCode as Group_Type_Code
from
    MW...MW MW,
    Mosaic.MosaicExport.dbo.D_MosaicGroupType D_MosaicGroupType,
    Mosaic.MosaicExport.dbo.F_MosaicAddresses F_MosaicAddresses
where
    (MW.UPRN = F_MosaicAddresses.Uprn) and
    (D_MosaicGroupType.GroupTypeId = F_MosaicAddresses.
        MosaicGroupTypeId)
group by
    MW."Creation Source",
```



Figure 3.5: Select data package for Report Studio

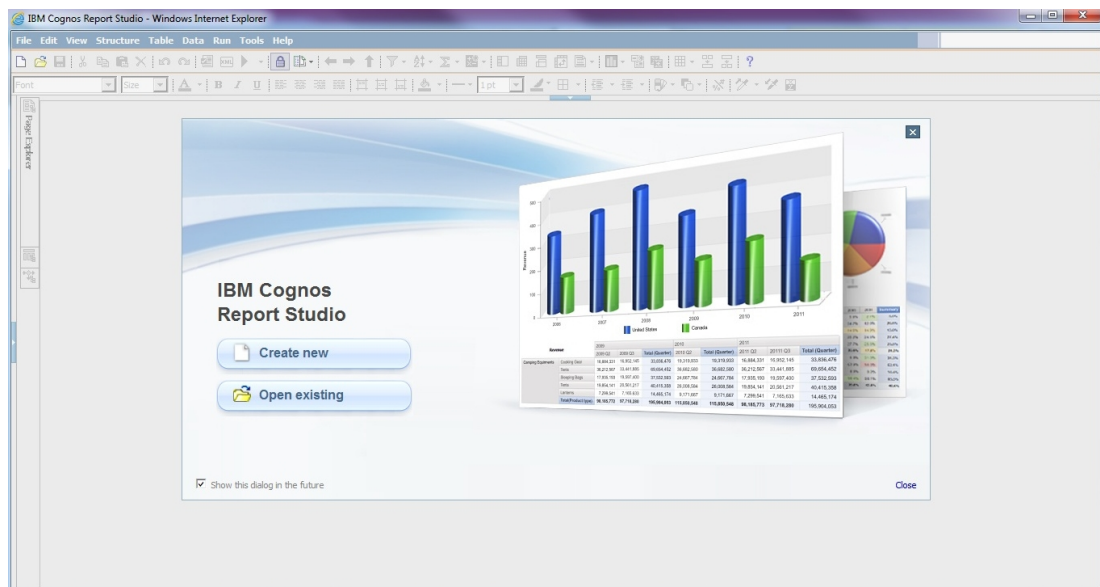


Figure 3.6: Report Studio welcome page

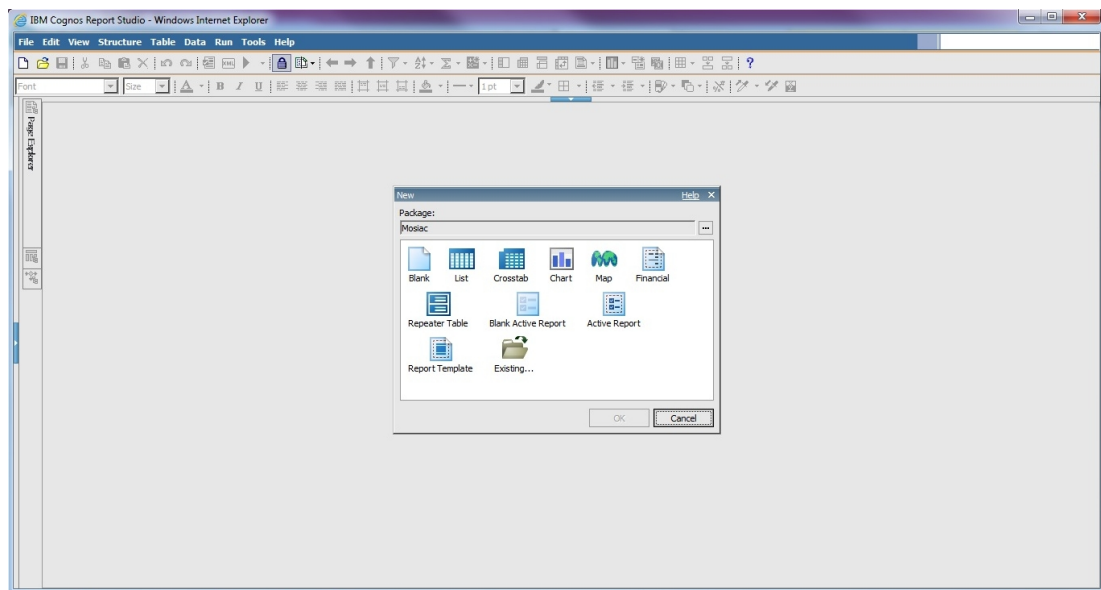


Figure 3.7: Select a template

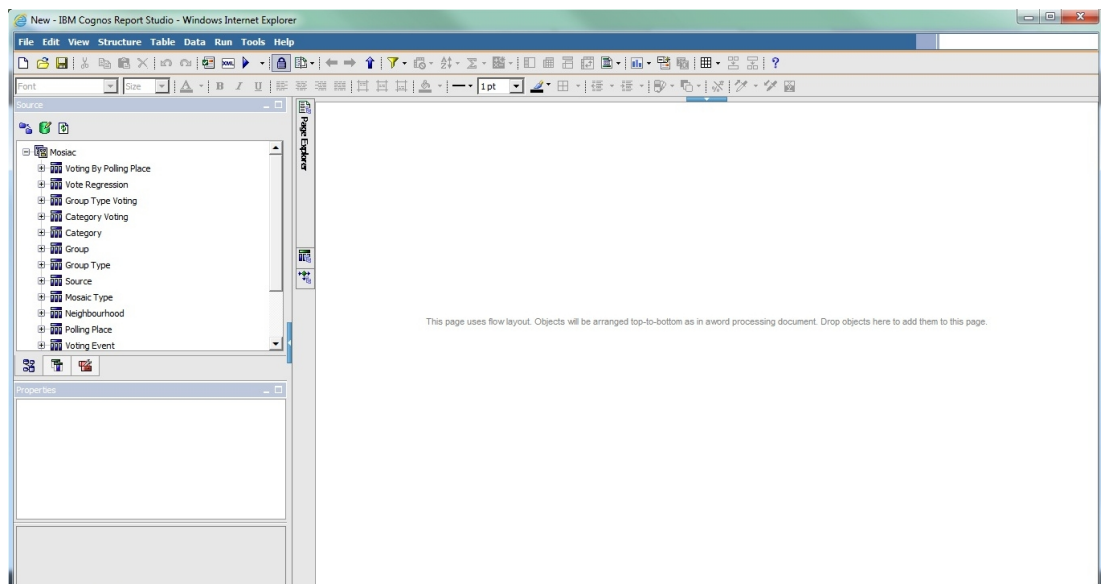


Figure 3.8: Blank template, Mosaic data loaded

```

    MW."Group",
    MW."Date Created",
    MW."Reference #",
    MW.Subject,
    MW."Product Hierarchy",
    MW.UPRN,
    D_MosaicGroupType.GroupTypeCode
filter
    (XCOUNT(MW."Reference #" at MW.UPRN,MW."Reference #" for MW.UPRN )
      > 3)
order by
    Date_Created asc

```

If an item is removed from a report it is permanently removed. In most cases, that is not the intention and cut function should be used instead.

The number of entries that can be imported from an external data source is limited to 20000. It is not a Council specific limit, it is a limit on the platform (?). When a new package is created on top of another, it is not overwritten a copy is created which contains both data sources.

3.2 Define

After the discovery phase an understanding of the specifics of the project within the Council has been achieved. The goal of the next phase was to narrow down the scope, find specific questions to be answered and make a decision about tools that would be used. Prototypes were created (simple reports) to prove the capabilities of the system. This phase ended with clear objectives and a general idea of technical aspects of implementing them.

3.2.1 Preliminary work

3.2.1.1 Meetings at the Council

The diagram below shows all people I interacted with in the entire project with those I spoke with in this phase highlighted by coloured background. Orange background being for University related people and blue for people working for CEC.

At this stage the clients were encouraged to drive the design decisions, e.g. they



Figure 3.9: CEC employees involved in the project.

had a final say in selecting questions to answer with this project. This was mostly done in cooperation with Sally Kerr and Andy Thomson.

The meetings were also trying to select tools that would be used and if possible try to confirm they could be used by building a simple prototype. This was mostly done in collaboration with people from BI section of CEC, Kevin Kelly and Angela McInnes.

Chris Jeffery was providing insights about the CRM dataset.

Emilio G. Zamudio was another student of University of Edinburgh that was working on a project with CEC. During discussions with him I wanted to ensure that scopes of our projects do not overlap.

3.2.1.2 First iteration (proof of concept)

The purpose of this stage was to go through the entire cycle of development. Before discussing what kind of analyses would be useful to the Council I had to confirm that it was possible to use the two datasets together and understand what limitations to the process were. There were no existing reports of this kind so I had to create the Cognos package for CRM and Mosaic data.

The Mosaic package has already been imported to the platform as it was being used in other Business Intelligence reports. The process of importing CRM data was manual, but it is planned to be automated in the future. It is assumed that UPRN uniquely identifies the user.

What I needed to do was to add to the Mosaic package on IBM Cognos an external source of data (CRM dataset) using built-in Extract, Transform, Load (ETL) mechanisms, which required administrative access rights. The platform is quite flexible when it comes to file extensions and data formats. Some of the acceptable extensions include: .csv, .xls, .xlsx, .xml. The CRM dataset was extracted from the Councils system and saved as an .xlsx file on a shared network drive. I then created the package and generated a few simple reports as described below.

3.2.1.3 Selected problems

3.2.1.3.1 Linking problem During the import stage where the CRM data was being added to the Mosaic package there was a problem with linking the two datasets. As a result, I was considering alternative solutions in which I would build the necessary tools.

One of the analysed solutions included setting up a server with an SQL/NoSQL

database, populating the database with the CRM and Mosaic data and then conducting analysis using SQL and Python. The focus of the project would shift and the insights generated would be of a different level and quantity. This would decrease usefulness of the project to CEC and move the project away from the initial objective.

After a couple of failed attempts with Cognos I wanted to go through the process step by step and document the problem in as much detail as possible and move on to building the new set up. I was using Cognos documentation in the process (IBM 2015c), (IBM 2015d). Fortunately, the detailed approach adopted has led to finding a solution and the platform could be used in the project.

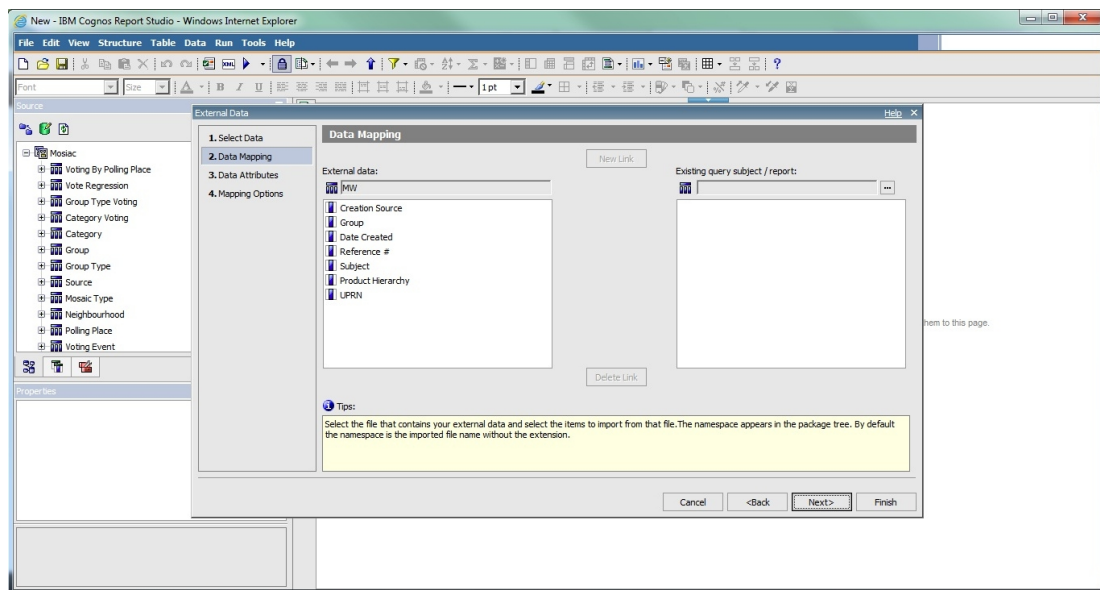


Figure 3.10: Importing CRM data to Report Studio, CRM data loaded, but Mosaic data unavailable for linking

3.2.1.3.2 CRM data

3.2.2 Design of the solution

3.2.3 Design brief for the next stage

3.2.3.1 Report 1 - cases of intentional use of multiple channels for the same issue

This analysis is aiming at identifying cases where citizens want to report an issue, but do not trust in it being handled the same way through different channels. The reasoning

behind such behaviour is that if many tickets are opened for the same problem, one of them will get the job done. It will be solved the quickest possible way, because if the process behind one channel has more resources available it will be handled quicker than with the process behind another channel.

The underlying assumption is that entries in the CRM system will not be identified as related to the same problem and that time of delivery differs across different channels.

The purpose of this analysis is not to provide evidence about the assumptions being right or wrong, but to verify if such behaviour exists among receivers of the Council services.

3.2.3.2 Report 2 - patterns of behaviour across different channels

3.2.3.3 Report 3 - who are the primary users of CEC services

3.3 Develop

The implementation stage of the project started with three objectives coming from the previous phase. Subsequently, three reports were generated to provide analysis in those areas.

Development started in a fresh environment. CEC has provided the author with a designated work space together with a laptop and all the access rights necessary for the implementation (access from the preliminary stage was revised and a different set up was used). Due to this, the IBM Cognos package containing Mosaic Experian and CRM data had to be recreated from scratch as described in the Define phase.

The process in all three cases was to design a technical solution first and then implement it. The solution, a generated report, would consist of a number of queries that would provide results necessary to answer a question or an intermediate step (in more complex cases) that lead to the desired insights. For more information on stages in the report creation please see attached appendix containing a list of files used in the process.

3.3.1 Report 1 - cases of intentional use of multiple channels for the same issue

This report is trying to provide evidence for existence of a specific type of behaviour where citizens report one and the same issue using many channels at the same time.

Proving such behaviour using solely data analysis is very difficult and should not be left only to an algorithm. One of the problems with this kind of analysis is that behaviour of people with different intents might manifest in the data in the exactly same way. The report might put in one category users, whose behaviour was malicious, but also non individual users like landlords, who visit many sites and then report a bulk of issues, residents who struggled with submitting a web-form or first time users of CEC services who were helped in submitting a web-form by a consultant over the phone.

It has to be stressed that this analysis is not trying to automatically mark people as bad users, but instead bring attention of a service manager to cases of unusual uses of the system. They might be pointing to a number of issues such as different delivery times across different channels, lack of trust in digital channels, low effectiveness of a channel in addressing a user need. They should be analysed and investigated further and should be treated as potential inspirations or initial influences for further improvement of service delivery.

3.3.1.1 Technical design

Query 1: gather all relevant data (do not include entries if channel is not specified) and add a counter for how many issues someone filed on one day

Query 2: filter results of Query 1 so that only people who reported more than one issue on one day regarding the same subject are left

Query 3: filter out from Query 2 cases with only one occurrence of such behaviour (of multiple issues regarding one subject reported on the same day)

3.3.1.2 Implementation

3.3.1.3 Additional work

3.3.2 Report 2 - patterns of behaviour across different channels

3.3.2.1 Technical design

3.3.2.2 Implementation

3.3.3 Report 3 - who are the primary users of CEC services

This analysis starts from identifying users belonging to two categories as described in the Define phase, i.e. citizens who interacted up to three times with the Council and active users with more than three issues reported. After that, a series of queries are used in order to provide insights about socio-economic background of users.

The letters at the bottom of charts (A,B,C,) are Mosaic groups. Detailed information about each group can be access using Mosaic Portal Segmentation. There, information is interpreted and visualised in a more human friendly way, as described in the Discover phase.

3.3.3.1 Technical design

3.3.3.2 Implementation

3.4 Deliver

3.4.1 Presentation at the Council

In the delivery phase, the author gave a presentation to CEC employees. The purpose was to present the project as a whole, show how to use the reports and evaluate their usefulness (receive feedback). Below are some quotes from the meeting in which Sally Kerr, Andy Thomson and Gosia Szymczak took part.

”Its very useful for us as well to have somebody coming from outside and giving us a fresh perspective and it is work that we have to continue with, so its really interesting”
Sally Kerr

”One of the questions that we had, which obviously I think you didnt really have time

to completely develop or it might be in your dissertation, was looking at () number of profiles we had and try to look at usage across those, because when we had originally done those profiles we made a best guess at the forms they would use the most. One of the questions was, did we get it right? () it would be very interesting to do that, because I think we are at a stage, moving with the new ICT supplier, to review that, to actually look at that model and then how is the supply going forward and also in terms of the communication campaign as well”

Sally Kerr

”We havent been doing anything as in depth as that because nobody has asked us to do that. Its interesting just to see () the person is trying and trying to do it three times on the web and its not going anywhere so there must be something.”

Gosia Szymczak

”I think the problem that we have () there is a bit of assumption with analysis there, which is very difficult to get away from unless you have user tests face-to-face () which I would recommend that we do, because however much () tracking tools, I still think you need to be going back to citizens just to actually make sure you are developing in the best way.”

Sally Kerr

”This is very interesting, just to get the indicators is very interesting and its something we can share, its just really important.”

Sally Kerr

”If a person is recording two or three times the same thing does that mean its one complain or is it three complaints from the same person. Its helping us understand and analyse the stats, have a look at the stats, if the stats are correct, because there are three complaints from the same person on the same thing from the same address.”

Gosia Szymczak

”What we need is a good methodology for how you would do that (solve problems experienced by users), because we dont have the resource to give that kind one-to-one all the time (go through an individual problem), so this is really useful.”

Sally Kerr

”To be honest, we should be really carrying out this kind of analysis regularly to actually see if behaviours are changing. () Thats a recommendation I would make, that we should be looking at how we do that for the future.”

Sally Kerr

”From Universitys point of view there are definitely opportunities, now we know how it all works for students to be involved with a particular piece of work if its felt to be of interest. Working with BI on that, we will discover other areas that will be very useful as well.”

Sally Kerr

3.5 Problems

In this part, selected problems experienced during the project are described. They are listed here in order to document the process as well as provide feedback for the design process:

- Due to informal form of the cooperation, for a substantial part of the project, the author did not have a pass to the building. It would be useful to have a starting date fixed in order to prepare a temporary pass and access rights for systems.
- The fact that the project had an open nature at the beginning was a very important part of it and helped in achieving a natural convergence between different teams of CEC and making the outcomes relevant and useful to the Council. However, this should not result in not having a clear business owner (e.g. Business Intelligence and Digital Service). Allocating even a small amount of resources (time of people involved) by senior management would help the project by not putting the burden of excessive time on CEC employees and would help in getting access to the licensed platforms within existing structures.
- In order to work with ICT systems in the Council a workstation (from the Council) is required. It would help to use a laptop together with the account created for the temporary pass that would have all the necessary accesses. During the project, the use of a laptop had to be supervised (putting additional burden on

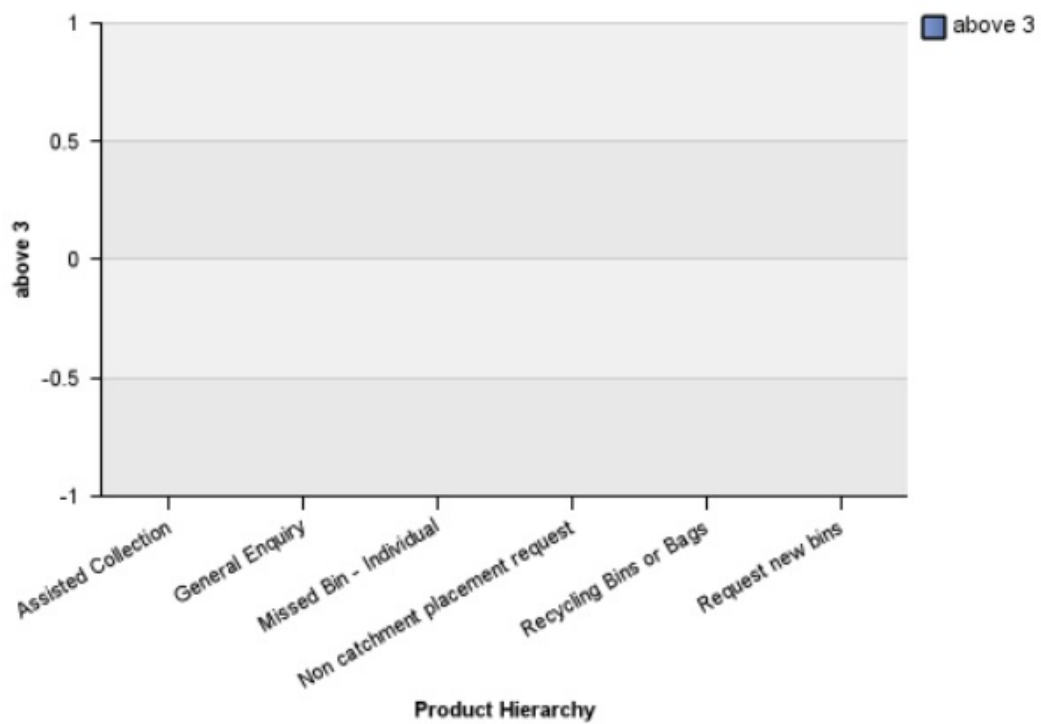


Figure 3.11: Report 3, Query 2. Aggregation function not set to "none"

CEC employees) together with an account that had extremely limited storage space.

- Difficulties were experienced when creating charts using calculated fields (no problems using values from a database). Charts do not work with automated aggregation function, you have to use none as the aggregation function.
- The CRM data source file had blank entries. IBM Cognos considered them valid (did not filter them out). They were showing up in all analyses as empty and could not be filtered out. There was about 4200 of them. They were removed from the extract manually.
- When a filter was implemented and then removed a result would be generated (different from when the filter was present). However, if the platform was restarted the results were different (for the same report).

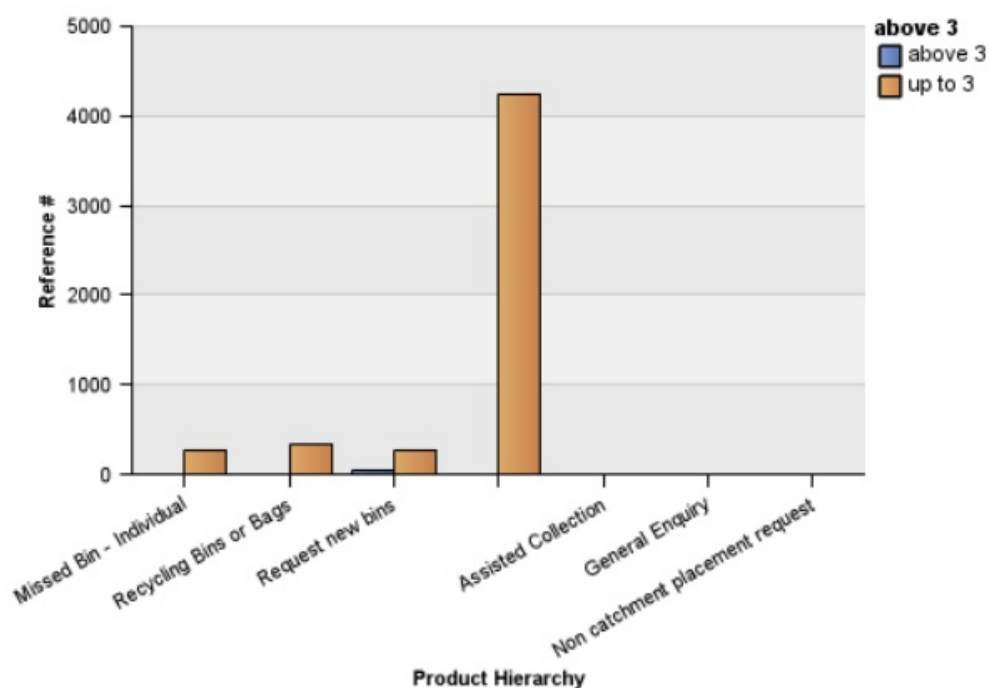


Figure 3.12: Report 3, Query 2. Empty entries showing up in all analyses

| Date Created | UPRN | one_uprn_one_day_one_subject_count | Creation Source | Subject | Reference # | Data Item1 |
|--------------|--------------|------------------------------------|-----------------|------------------------------|---------------|------------|
| 15-05-12 | 000906037096 | 2 | Web | Missed bin or box | 150512-001300 | 4 |
| 15-05-12 | 000906037096 | 2 | Web | Missed bin or box | 150512-001304 | 4 |
| 15-05-15 | 000906037096 | 2 | Web | Recycling bags or bins | 150515-000318 | 4 |
| 15-05-15 | 000906037096 | 2 | Web | Recycling bags or bins | 150515-000319 | 4 |
| 15-05-18 | 000906037096 | 2 | Phone | Recycling bins or bags | 150518-001012 | 4 |
| 15-05-18 | 000906037096 | 2 | Phone | Recycling bins or bags | 150518-001073 | 4 |
| 15-05-19 | 000906024115 | 2 | Phone | Recycling bins or bags | 150519-000524 | 1 |
| 15-05-19 | 000906024115 | 2 | Phone | Recycling bins or bags | 150519-000543 | 1 |
| 15-05-19 | 000906024115 | 2 | Web | Recycling bags or bins | 150519-000495 | 1 |
| 15-05-19 | 000906024115 | 2 | Web | Recycling bags or bins | 150519-000496 | 1 |
| 15-05-20 | 000906037096 | 2 | Web | Request bins - General green | 150520-000555 | 4 |
| 15-05-20 | 000906037096 | 2 | Web | Request bins - General green | 150520-000712 | 4 |
| 15-05-23 | 000906006873 | 2 | Web | Missed bin or box | 150523-000003 | 2 |
| 15-05-23 | 000906006873 | 2 | Web | Missed bin or box | 150523-000004 | 2 |
| 15-05-30 | 000906006873 | 2 | Web | Missed bin or box | 150530-000068 | 2 |
| 15-05-30 | 000906006873 | 2 | Web | Missed bin or box | 150530-000069 | 2 |

Figure 3.13: before restarting platform

| Date Created | UPRN | Creation Source | Subject | Reference # | one uprn data subject | Data Item1 |
|--------------|--------------|-----------------|------------------------------|---------------|-----------------------|------------|
| 15-05-23 | 000906006873 | Web | Missed bin or box | 150523-000003 | 2 | 2 |
| 15-05-23 | 000906006873 | Web | Missed bin or box | 150523-000004 | 2 | 2 |
| 15-05-30 | 000906006873 | Web | Missed bin or box | 150530-000068 | 2 | 2 |
| 15-05-30 | 000906006873 | Web | Missed bin or box | 150530-000069 | 2 | 2 |
| 15-05-12 | 000906037096 | Web | Missed bin or box | 150512-001300 | 2 | 4 |
| 15-05-12 | 000906037096 | Web | Missed bin or box | 150512-001304 | 2 | 4 |
| 15-05-15 | 000906037096 | Web | Recycling bags or bins | 150515-000318 | 2 | 4 |
| 15-05-15 | 000906037096 | Web | Recycling bags or bins | 150515-000319 | 2 | 4 |
| 15-05-18 | 000906037096 | Phone | Recycling bins or bags | 150518-001012 | 2 | 4 |
| 15-05-18 | 000906037096 | Phone | Recycling bins or bags | 150518-001073 | 2 | 4 |
| 15-05-20 | 000906037096 | Web | Request bins - General green | 150520-000555 | 2 | 4 |
| 15-05-20 | 000906037096 | Web | Request bins - General green | 150520-000712 | 2 | 4 |

Figure 3.14: after restarting platform

Chapter 4

Analysis and evaluation

4.1 Evaluation of the tools used

4.1.1 CRM data

The CRM data is easy to extract from the RightNow system and it is formatted in a way that can be read by Cognos to build a package. The incidents table provides a very detailed picture of what is happening on every channel as entries are created even for queries where full data cannot be provided.

The incidents table in the CRM system provides a lot of data for analysis, but is not sufficient to understand fully the situation around an interaction between a resident and the CEC. It would be extremely useful to combine it with analysis of unstructured data, e.g. comments left by consultants interacting with citizens.

The incidents table in the CRM system contains only information about transactions initiated by citizens, e.g. they submitted a web-form. It would be very useful to combine this data with web analytics to widen the analysis and add cases where the form was not submitted, e.g. someone started filling the form, but for some reason did not submit it or made a phone call to the Council instead.

In Report 1, Query 3, in the results you can see that on 05-15 and 05-18 someone contacted CEC regarding a service from the same Product Hierarchy. However, they used different channels and values in field subject are different. This is probably due to inconsistencies in implementations between web and phone channel. This has an impact on the quality of data.

The incidents table in the CRM system does not contain a field that allows identification of all entries related to one problem. Up to authors best knowledge there

is no mechanism at the moment to link multiple incidents entries regarding the same problem, e.g. many people reporting the same bin as missed.

It was difficult to determine a number of things about the CRM system and data. It would have been useful if access to the documentation was provided or a person knowledgeable about the system could provide support.

The results of the project were greatly limited by resources, in particular by the time available. If there was more time it would be possible to review other tables in the database (instead of only relying on the suggestion of clients).

4.1.2 IBM Cognos

Cognos is a very robust platform. It makes many steps in the development process smoother and provides very convenient channels for publishing. It deals well with ETL activities, i.e. exporting data from many formants, the initial processing of integrated data. With Cognos one can work with both relational and dimensional data at the same time, e.g. SQL and OLAP can be used on separate datasets and be combined in one report. It makes editing easier, e.g. changing a field in one part changes it everywhere else. There are free, learning resources available online the official documentation, cookbooks, tutorials (MIT, 2015). However, some things are not very intuitive and you have to learn how to think about them in Cognos categories. There are also many small bugs that havent been solved for a long time probably due to long life cycles of the product.

4.2 Evaluation of the work undertaken

The work undertaken in this project by no means exhausts the objectives or needs at the Council. There are many improvements that could be done even to the reports themselves, e.g. drill through reports user selects a service, a chart is displayed with columns showing use across Mosaic groups and clicking on a columns open another chart showing the use within the Mosaic group represented by this column.

4.2.1 Report 1

This report was looking for evidence of a specific behaviour in users. Therefore, it was not an open question in its nature. A set of metrics described this behaviour and implementing them provided desired information addressing this objective.

4.2.2 Report 2

The second analysis was more exploratory. It was not looking for anything in particular, but rather was trying to cast some light on behaviours. As such, the data dictated the direction of this report.

After initial findings it was clear that the analysis would benefit a lot from adding other sources of data to Cognos. One idea included adding unstructured data, such as comments of consultants handling an issue. Although it was possible to point to unusual cases, the incidents table was in many cases insufficient to provide definitive answers. It gives very detailed information, e.g. which interface citizens use and how, who uses them (which can help when controlling demographics in focus groups), but not details about the interactions regarding a particular issue. Another idea was to add web analytics data. The incidents table contains only information about issues reported to the Council. If a user went to the website and failed to submit a web form it would not be picked up by the CRM system. This potentially leaves out a lot of information about negative experiences of users.

Considering the above, this report in no way exhausts the topic and there are many questions to be answered. It might point a service manager to specific cases, but they require further analysis.

4.2.3 Report 3

Last report is the most complex one. The objective, which was to show who primary users are, was achieved to an extent possible using Cognos. A number of charts were created showing the usage among citizens from different perspectives, giving a general overview and a detailed insight into specifics. It visualises the use across all services and the use of a specific service in different social groups. After viewing the charts, the information about social groups can be interpreted using Mosaic portal (Segmentation), e.g. read the description of A01 group. The Mosaic package allows creation of charts with metric specific information, e.g. age distribution among users. However, UPRN, used by both Mosaic and CRM, is unique to a household and so those datasets are designed to deliver personas as a whole. Having that in mind, the objective from the Define stage was to create a full picture using personas rather than analysing one attribute.

4.3 Evaluation of methodology used

The double diamond approach seems to reflect very well the dynamism of real life projects. The model describes a rhythm of activities that comes naturally. It includes a very open, exploratory first stage which leaves space for flexibility in adapting to what would be useful to the client.

The Discovery phase was extremely helpful in understanding the context of the problem and establishing ground before the next phases. Having such an open attitude requires a lot of persistence. The responsibility for the entire project rests on the designer and this causes a creative stress. In the early stages, it is desired to not be limited by having a concrete idea of what to do in the project (which is not synonym with not having a path of action). The designer is exposing himself to the unknown and at many points the project could completely change direction or a path could be closed unexpectedly. It is critical to maintain composure, agility and be able to quickly adjust to the new conditions. It is also important to mention that it exposes the project to the will of people across the entire organisation. The more the involved people are open and willing to help the better the outcome of the project will be. In terms of this particular project, the Council employees were very helpful and open-minded and their support has helped tremendously.

The three objectives that came from the Define phase (design brief) were developed in close cooperation with the beneficiaries (and at the same time the requesting party).

The Develop phase managed to address all questions from the previous stage. Having clear, measurable objectives, which were thought through, helped in planning the rest of the process and designing the technical aspects of it. The extent to which implementations were able to solve those problems was described in sections above (Evaluation of work undertaken).

The key outcome of Deliver stage was feedback from clients. It was very helpful to understand the extent to which it addressed actual needs and whether it succeeded in contributing to the on-going efforts in the Council (being in line with the current ICT strategy at the Council).

Chapter 5

Conclusion

Out of this project come many open questions and potential for further study. This dissertation gives a lot of details about the context of the project which were not available before. They can be of significant help in future endeavours.

The double diamond approach was particularly good at enabling cross department activity and flexibility in adjusting the scope of the project to the needs of the Council. Given the experience gained, a further study could try and evaluate different methods used at each stage of the process.

It is also important to stress that such projects are very agile in nature and depend heavily on the organisation in which they are run, i.e. on the knowledge of people involved and their willingness to share it. This project is a great example of how open-mindedness of employees can help.

The timescale of the project was extremely short given its complexity. Many parts of it could easily take months to be properly developed. However, it was not aiming at delivering a fully-fledged product. Instead, the objective was to help the Council with evaluating new ways of thinking and working and looking at the design process in its entirety. As a result in many cases compromises had to be made.

BI reports like the ones generated in this project, should be treated as part of a bigger transformation project. Identifying cases where users struggled with a web interface by CRM data analysis should be one of many tools in the repertoire of a service manager. For example, they can be used to identify the demographics of people to invite for participation in a focus group.

Reports like these often raise further questions, e.g. when conducting analysis other things start emerging which could be objects of investigation themselves. There is a vast amount of possible insights coming from the CRM data.

The reports can be used by CEC employees on other data sets (it is a matter of pointing to a different source file).

Coming up with insights and recommendations is only one step. Another question is how to manage a change in an organisation in order to benefit from those analyses. Ability to adapt to user needs and learn from the feedback is actually executed when such insights are followed by tangible actions such as a decision to deploy a change or a confirmation that current efforts are not misplaced.

Appendix A

Aliquam erat volutpat

(If you're wondering what all this weirdness is, check out
<http://www.subterrane.com/loremipsum.shtml>)

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Figure A.1: Nunc lacinia

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