# Factors contributing to student outcomes in Northern Ireland FE Colleges - An Econometric Analysis. 

June 2016
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## Overview

Retention and achievement rates (and as a consequence success rates) have been improving steadily in the Further Education sector in recent years. However, the Department for the Economy (DfE) is aware of significant variations in the rates of successful outcomes within the sector - for example, across different student characteristics, subject areas and colleges.

It is recognised that using raw data alone to compare performance across the sector may not reveal the full picture and an in-depth statistical model has been developed to understand these differences in more detail. This paper reports the results of an investigation of the broad factors ${ }^{1}$ which affect the likelihood of success of final year enrolments in courses potentially leading to a regulated qualification from the Further Education sector in Northern Ireland, based on data from academic years 2012/13 to 2014/15.

The results show that, even after adjusting for other characteristics (i.e., conducting a like-for-like assessment of student outcomes); some colleges perform better than others. 'Subject studied' matters for successful student outcomes, for example students that are studying Science and Mathematics subjects have a lower likelihood of success than is the case for other disciplines.

We find that on an adjusted basis, the 'level' of study (i.e. NQF levels) and 'mode' of attendance (i.e. full-time vs part-time) are important factors in explaining variance in successful outcomes among students. The analysis shows that those studying at Level 4 and above and those in full-time study enjoy a higher likelihood of success. We also find that the more affluent the area in which a student is from, the better their chances of success, after controlling for other (measurable) student and institutional characteristics.

This analysis is intended to assist colleges' in the development of their pastoral care and student support programmes, provide advice and guidance to promote the health and well-being of students; shape curriculum plans; identify and address weaknesses; and learn from best practice across the sector. It is important to note however, that the analysis is one of many sources of information colleges should use to improve the quality of their service delivery. In addition, all student needs are assessed at an individual level to identify the appropriate interventions. This research only provides insight into the likely allocation of resources and should not be interpreted as prescriptive.

[^0]While DfE has confidence in the output from this analysis, the Department is keen to continue to work with others, including the Further Education sector, to develop it further through the improvement of data collection (particularly in the areas which are non-mandatory).

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## 1. Background

1.1 In December 2015, the Department for the Economy (DfE or 'the Department') commissioned the Ulster University Economic Policy Centre (UUEPC) to undertake econometric modelling on Further Education (FE) final year enrolment data.
1.2 DfE has previously undertaken econometric modelling on FE outcome data identifying the factors contributing to successful student outcomes in Further Education. That work was published in $2013^{2}$, and there is now a desire to update the work based on the latest data covering academic years 2012/13 to 2014/15.
1.3 The original project was commissioned following a recommendation from the Department's May 2010 'DEL Quality and Performance: A Baseline Analysis' report ${ }^{3}$. A key issue identified in the 2010 baseline analysis was the extent of variability in successful outcomes across the Department's skills provision. This included a number of high level observations, such as some social groups being more likely to gain a qualification than others and success rates varying across education and training providers as well as across subject areas.
1.4 The Ulster University provided advice to DfE on the development of the original FE outcomes econometric model in autumn 2010 as well as peer reviewing the 2013 report. Professor Vani Borooah (Professor of Applied Economics) and Dr. Mark Bailey (Senior Lecturer in Economics) both from the University of Ulster (School of Economics) advised on the original project. Dr. Mark Bailey has been retained on this current analysis of the Further Education Leavers Survey (FELS) and Consolidated Data Return (CDR) dataset. Consequently, continuity, in terms of team membership and expertise from Ulster University, has been maintained.

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https://www.delni.gov.uk/sites/default/files/publications/del/What $\% 20 \mathrm{Factors} \% 20 \mathrm{Contribute} \% 20$ to $\% 20 \mathrm{Success}$ ful $\% 20 \% 28$ Northern $\% 20$ Ireland $\% 29 \% 20$ Student $\% 20$ Outcomes $\% 20 \mathrm{in} \% 20$ Further $\% 20 \mathrm{Education} \% 20 \mathrm{An} \% 20 \mathrm{Ec}$ onometric\%20Analysi.pdf
${ }^{3}$ Page 105
1.5 The analysis has been undertaken to augment the comprehensive information already available on college performance. It recognises that using raw data alone to compare performance across the sector may not reveal the full picture. In addition, the analysis looks at enrolment numbers, rather than numbers of students (many students enrol in more than one course in any given year). In total, there are 155,795 individual students within this analysis equating to approximately two enrolments per student. Although not undertaken in this study, future research may wish to consider analysis based on student, rather than enrolment outcomes.
1.6 The technique used in this analysis (and outlined in detail at Section 4 of this report) provides a more sophisticated basis on which to undertake a like for like assessment of college performance (accounting for a wide range of factors).

## 2. Introduction to the Further Education sector

2.1 The Further Education (FE) sector is the main provider of professional and technical education and training in Northern Ireland. The courses provided by the sector are wide ranging and spans the Essential Skills of literacy, numeracy and ICT, professional and technical provision particularly at Levels 2 and 3, academic programmes and Higher Education courses.
2.2 The FE sector in Northern Ireland is made of up six colleges which are:

- Belfast Metropolitan College (BMC);
- Northern Regional College (NRC);
- North West Regional College (NWRC);
- South Eastern Regional College (SERC);
- Southern Regional College (SRC); and
- South West College (SWC).
2.3 Over the period 2012/13 to 2014/15 the number of enrolments in FE regulated courses ${ }^{4}$ has decreased from 156,806 to 140,137 , a fall of $10.6 \%$. This is part of a longer term trend falling from a peak of 163,350 in 2009/10 (see Chart 2.1 overleaf). The Department's "Delivering Success Through Excellence" 2016 report attributed this change as being due to demographics and economic recovery, a focus on economically relevant courses and decreases in recreational (hobby \& leisure type) courses.

[^1]Chart 2.1: FE Regulated enrolments (2003/04 to 2014/15)


Sources: DEL "Further Education Statistical Record (FESR)" 2003/04 to 2012/13; Consolidated Data Return (CDR) 2013/14 to 2014/15
2.4 The FE sector continues to engage successfully with those students from more deprived backgrounds. Approximately $20.5 \%{ }^{6}$ of regulated FE participants are drawn from the $20 \%$ most deprived regions (according to the Northern Ireland Multiple Deprivation Measure) in 2014/15 period.
2.5 Three key metrics of FE performance, within regulated provision, are retention rates, achievement rates and success rates. They are defined as follows:

- Retention rate - the proportion of final year students who complete their course (the vast majority of FE enrolments are on courses of one year or less);
- Achievement rate - of those that complete their course, the proportion who achieve the qualification they were aiming for; and
- Success rate - the overall measure of performance, which is the proportion of the number of enrolments who complete their final year of study and achieve their qualification to the number of final year enrolments.

[^2]Chart 2.2: FE Retention and Achievement rates (2010/11 to 2014/15)


Source: DEL "Further Education Activity in Northern Ireland, 2010/11 - 2014/15"" (Table A29)
2.6 Whilst the number of enrolments has been in decline since the 2009/10 peak, this shows the FE sector has been able to maintain and improve its performance over the last five years.

## 3. Defining 'Success’

3.1 DfE is responsible for the policy, strategic development and financing of the statutory FE sector. This includes curriculum policy to ensure that colleges' provision is focused on meeting the needs of the Northern Ireland economy. Quality improvement is also a key strategic priority for the Department, an important element of which is monitoring colleges' performance in terms of learner retention, achievement and success.
3.2 In this analysis, a successful outcome is defined as an enrolment that enters the final year of their course (including one year courses) and who fully or partially ${ }^{7}$ achieves the (regulated) qualification they were aiming for.

## - Success Rate $=$ Retention Rate $\mathbf{x}$ Achievement Rate

3.3 In 2014/15, $83.1 \%^{8}$ of all FE regulated enrolments were in the final year on their course. Both the retention and achievement attributes are identifiable within the Further Education Leavers Survey (FELS) ${ }^{9}$ and Consolidated Data Return (CDR) ${ }^{10}$ datasets, which contains individual data on those enrolments that enter the final year of their course and their level of achievement.
3.4 Having defined success, it is also necessary to define those who did not succeed. The FELS \& CDR datasets capture a number of different outcome classifications in addition to 'full' or 'partial' achievement. For the purposes of this project, those who do not succeed are defined as final year enrolments whose outcome was recorded as 'no achievement', 'result not yet known', 'study continuing' or 'results returned directly to students'. Section 4 provides

[^3]further detail on the composition of the 363,333 final year enrolments through the period of 2012/13 to 2014/15.
3.5 Charts 3.1, 3.2 and 3.3 show retention, achievement and success rates in the FE sector, by college, over the last five academic years - 2010/11 to 2014/15 (DEL/DfE only began publishing annual FE retention, achievement and success rate data from 2010/11). The wider analysis in this report focuses on the observed difference in success outcomes in each of the 2012/13, 2013/14 and 2014/15 academic years only. The analysis on the 2010/11 and 2011/12 data was completed and reported on previously.

Chart 3.1: Retention rates in the NI FE Sector 2010/11 to 2014/15


Source: DEL "Further Education Activity in Northern Ireland, 2010/11 - 2014/15" (Table A29)

Chart 3.2: Achievement rates in the NI FE Sector 2010/11 to 2014/15


Source: : DEL "Further Education Activity in Northern Ireland, 2010/11-2014/15" (Table A29)

Chart 3.3: Success rates in the NI FE Sector 2010/11 to 2014/15


Source: DEL "Further Education Activity in Northern Ireland, 2010/11 - 2014/15" (Table A29)
3.6 Chart 3.1 indicates that retention rate performance has varied across the sector. SRC has been consistently strongest in terms of retention with rates fluctuating between $92 \%$ and $93 \%$ over the five-year period. Three colleges improved retention performance, SWC, SERC and NWRC from 2010/11.

BMC has been broadly static and NRC has been trending down, but only marginally.
3.7 In terms of achievement, Chart 3.2 shows that performance has improved significantly across five of the six colleges. The one exception is SWC, where achievement performance has been broadly static ( $86.2 \%$ in $2014 / 15$ is an improvement of only 0.7 percentage points (p.p.) since 2010/11). In 2014/15 the gap between the highest and lowest performing college is relatively small (5.1 p.p.) and has been decreasing.
3.8 In combination these movements have led to increasing success rates across the sector as shown in Chart 3.3.
3.9 The purpose of this econometric research is to provide a greater understanding of the extent to which this performance gap can be explained by student characteristics and types of courses delivered.

## 4. The Econometric Model

4.1 Understanding how the performance of a final year student is influenced by the personal characteristics and circumstances of the student and the institutional characteristics of their college is an important issue for the FE sector and policy makers more generally.
4.2 For example, knowing a male student is less likely to gain a successful outcome than a female student (all other things being equal) can help focus efforts and pastoral support towards those who need it most. Importantly, this should be used for guidance purposes only as not all students with the same characteristics will have the same need for support. The existing approach of providing individually tailored support for students should be maintained.
4.3 In order to identify such factors, a logit model was developed in which the dependent variable $\mathrm{Yi}=1$ if student i had a "successful" outcome (i.e., full or partial achievement) and $Y i=0$ if he/she did not have a "successful" outcome. The logit equation is:
for $K$ coefficients $\left(\beta_{i}\right)$ and for observations on $K$ variables $\left(X_{i}\right)$ where:

$$
\operatorname{Pr}\left[Y_{\mathrm{i}}=1\right]=\frac{e^{\beta \times X_{i}}}{1+e^{\beta \times X_{i}}}
$$

4.4 For an individual to be included in the econometric analysis, a complete data profile must be available against each variable (i.e., a valid data entry for each variable being modelled). If an individual has a missing data entry for any single variable included in the model, then that enrolment (individual) is automatically removed from the analysis.
4.5 DfE is keen to work with the FE sector to minimise the level of missing data, to include all key explanatory variables and to ensure the results of the model are understood fully. It is through engagement that the impact of the model can be maximised. Engagement with the sector and others has already
proved helpful and a number of improvements have already been made following feedback from previous publications.
4.6 That feedback tended to focus on the limitations of the model and these are listed below along with comments from the Department:

- The use of Northern Ireland postcode data to assess social background has the impact of excluding all Republic of Ireland (Rol) students from the analysis;

The student postcode is used to determine the Super Output Area (SOA) in which they live. Each of the 890 SOAs across NI have a Northern Ireland Multiple Deprivation Measurement (NIMDM) score, which indicates the level of deprivation of that area, relative to the other SOAs. Although Rol postcodes do not have a NIMDM score, households in Rol have recently been assigned a postcode by the government and DfE have initiated consultations to determine if a similar deprivation score could be applied and if it could be used in a similar manner to NIMDM.

Moving away from the use of postcode data could require students to provide additional data (which may be more difficult to obtain) and hence add to the burden of those providing and capturing data. Greater levels of missing data in this field could result in the measure not being included in the analysis.

- Other important variables such as the size of the local grammar cohort, retention levels in non-grammar post-primary schools and the balance between 11-16 and 11-18 age group schools;

It is recognised that in an area with a large local grammar cohort and/or higher retention levels in the non-grammar post-primary, one would expect a lower success rate as well as lower overall enrolments. The information required to undertake that more detailed analysis is not currently available in the relevant datasets. Consideration will be given to ways in which this information could be captured for future research.

- Data on employment prospects and earnings post-qualification could help explain retention and achievement. To this end DfE are working on enhancing the FELS dataset;

The Department undertook to develop a Further Education Leavers Survey (FE Leavers Survey) to assess the destinations and potential benefits to students on completing and achieving a regulated qualification at a Further Education College in Northern Ireland.

The first annual survey (FE Leavers Survey 2015) provides details on the destinations and potential benefits to students, approximately six months after FE Course completion and achievement.

The findings indicate a range of FE Leaver destinations, which include progression into employment or further learning. The recent publication of the FE leavers survey analysis is available at:
https://www.delni.gov.uk/fe-leavers-survey-2015

- Some colleges are more effective at recording enrolment information, which in turn can lead to over and under representation of students from different colleges.

A new data process to collate all enrolments in FE colleges was introduced in 2013/14, called the Consolidated Data Return (CDR). This return has an accompanying automated validation report, which is produced on a daily basis. This permits FE colleges to review the quality of their data. These automated reports aim to ensure the data is fit for purpose for the college and the department.

There are a number of non-mandatory fields within the CDR, where the student is not required to provide a response and therefore missing data will remain an issue in some fields. With any administrative data system there is a specific primary focus (in this case FE college enrolments) while others (in this case the Department) are using it for secondary analysis and therefore have to accept certain limitations in the data.
4.7 As noted above, the Northern Ireland Multiple Deprivation Measure (NIMDM, 2010) score is used as a proxy to assess social background. The NIMDM 2010 measure is based on seven types of deprivation, including: Income; Employment; Health and Disability; Education, Skills and Training; Proximity to Services; Living Environment; and Crime and Disorder.

## Data Overview

4.8 The independent variables used in the econometric analysis and included in the dataset are ${ }^{11}$ :

- Student status
- Outcome
- College
- Age
- Gender
- Adult dependents
- Child dependents
- Level of study
- Mode of study
- Ethnicity
- Marital status
- Disability
- Employment status
- Urban/rural domicile
- Social background (based on postcode)
- Subject studied
- Year studied.

[^4]4.9 As indicated above, to eliminate incomplete data profiles, the full FELS \& CDR datasets were reduced to create a sample dataset. Table 4.1 below provides an overview of the extent to which the dataset was reduced across all three academic years for the analysis.

## Table 4.1: Comparison of the full and reduced dataset

$$
2012 / 13-2014 / 15
$$

Full (Population) dataset 363,333
Sample dataset (Reduced)
257,241
\% data used
71\%
4.10 To prevent the extensive loss of observations within the analysis, DfE and UUEPC agreed that any independent variable with more than $20 \%$ missing observations would be excluded. As a result, qualifications on entry and community background have not been included within the analysis (having $22 \%$ and $25 \%$ incomplete observations respectively). A full breakdown of how the reduced dataset compares to the overall FELS \& CDR datasets are presented at Annex 2. The breakdown shows that the sample datasets, on which econometric results are based, is broadly comparable with the larger (population) dataset.
4.11 Overall data capture on factors that impact a successful outcome has improved since the last FE Outcomes report published by the Department, based on 2011/12 data. In that year the sample dataset was 59\% of the full (population) dataset and in this three-year period (2012/13 to 2014/15) it varied from $64 \%$ to $78 \%$ with an average of $71 \% .^{12}$
4.12 Table 4.2 below shows the comparison of full and reduced datasets by college. This highlights the extent to which colleges have students who do not complete all data fields (typically the non-mandatory fields) in the enrolment forms. NRC have been consistently strong and over $80 \%$ of the

[^5]original records in the dataset could be used in the final analysis, but all colleges have improved since 2012/13.

Table 4.2: Comparison of full and reduced datasets by college

| College | $\mathbf{2 0 1 2 / 1 3}$ | $\mathbf{2 0 1 3 / 1 4}$ | $\mathbf{2 0 1 4 / 1 5}$ | All years |
| :--- | :---: | :---: | :---: | :---: |
| BMC | $58 \%$ | $67 \%$ | $69 \%$ | $\mathbf{6 5 \%}$ |
| NRC | $89 \%$ | $90 \%$ | $90 \%$ | $\mathbf{8 9 \%}$ |
| NWRC | $64 \%$ | $65 \%$ | $65 \%$ | $\mathbf{6 5 \%}$ |
| SERC | $56 \%$ | $69 \%$ | $91 \%$ | $\mathbf{7 2 \%}$ |
| SRC | $59 \%$ | $64 \%$ | $68 \%$ | $\mathbf{6 3 \%}$ |
| SWC | $71 \%$ | $82 \%$ | $83 \%$ | $\mathbf{7 9 \%}$ |
| Total | $\mathbf{6 4 \%}$ | $\mathbf{7 2 \%}$ | $\mathbf{7 8 \%}$ | $\mathbf{7 1 \%}$ |

How can the model be used?
4.13 The econometric model estimates the variables that most affect the probability of successful outcomes. Therefore, it is possible to estimate the extent to which a change in a particular characteristic (individual and/or institutional) will affect the probability of success with all other characteristics unchanged. So, for example, it enables us to ask:

- How does the college an individual attends affect their likelihood of success, after accounting for other potential influences (gender, social background, level of study etc.)?
4.14 This econometric approach (logistic regression) is used extensively in numerous disciplines, including the medical and social science fields. In the medical field, for example, logistic regression is often used to predict the likelihood that a patient will get a given disease (e.g., diabetes) based on observed characteristics of the patient (age, gender, body mass index, results of various blood tests, etc). In the social sciences, logistic regression is used extensively to predict voting patterns, based on age, income, gender, race, state of residence, votes in previous elections, etc.
4.15 This particular model correctly predicts $77.8 \%$ of individual outcomes. Additionally, the Wald Test ${ }^{13}$ proves that the model is statistically significant. The Wald test as used here is a way of testing the joint significance of explanatory variables in a statistical model in a manner analogous to the F test often used in Ordinary Least squares analysis (i.e. it tests the estimated coefficients of the independent variables against a null hypothesis that the coefficients are all in fact zero). The Wald value of the model is 9096.26 which significantly surpasses the critical values of a chi ${ }^{2}$ test with 43 degrees of freedom of 59.30 at the $95 \%$ level and 67.46 at the $99 \%$ level.
4.16 The results of estimating the logistic equation on the data is shown in Annex 1.

[^6]
## 5. Results

## Introduction

5.1. This section of the report sets out the results of the econometric analysis and assesses the impact the following variables had on achieving a successful outcome:

- Success rates across colleges;
- Impact of the subject mix studied;
- Impact of level (NQF level) and mode (Full-time/ Part-time) of study;
- Impact of age of student;
- Impact of gender and urban/rural living;
- Impact of disability (self-reported);
- Impact of the social background/deprivation of student;
- Impact of ethnicity and marital status of student;
- Impact of employment status (self-reported);
- Impact of dependants (adult/child);
5.2. The following analysis is an update of the previous econometric modelling work undertaken by the department on FE outcomes, published in $2013^{14}$ (refer to paragraph 1.2). The narrative below often makes reference to this previous analysis.

[^7]
## Success rates across colleges

## Unadjusted data

5.3. Analysis of the unadjusted data highlights that there is considerable variability in success outcomes across colleges in the sector, before any like for like adjustment is made through the logistic regression model. In presenting the analysis one college is selected, in this instance South West College, as a reference to compare performance against all other colleges. South West College was chosen as the reference as it is a mid-performing college in terms of successful outcomes (but in practice any college could be selected as the reference for presentation purposes). The percentage difference in success (unadjusted data) across the colleges is shown in Figure 5.1 below.

Figure 5.1: Percentage difference from SWC in success rates by college (2012/13 to 2014/15 - Unadjusted data)


Source: DEL "Further Education Activity in Northern Ireland, 2010/11 - 2014/15" (table A29) Note: 1. South West College (SWC) has been selected as the reference college.
5.4. Over the three-year period for which the data was analysed, there was a 9.2 percentage point (p.p.) gap between the lowest performing college and the highest performing college (i.e. SRC $+5.7 \%$ and BMC $-3.5 \%$ ). This analysis has been conducted with a combined three-year dataset, compared to annual datasets used in previous analyses. As a result, the quality of data should be improved and the results of the econometric analysis should be more robust.

Data quality improvements have been implemented and continue to be addressed on an on-going basis with the Colleges. It is intended to have the data accredited as 'National Statistics' following a quality assessment process by the UK Statistics Authority during 2017. The results for the impact of factors affecting success rates and the analysis across colleges in this study supersede and replace those previously published in 2013. However, caution should be taken when interpreting these results with the caveats outlined at section 5.10.

## Adjusted data

5.5. However, the unadjusted success rate figures do not provide a full reflection on college performance across the sector. Some colleges could have larger proportions of students with characteristics which make them more pre-disposed to achieving a successful outcome. Therefore, it is necessary to undertake an analysis that aims to identify the individual impact of each of the characteristics on the likelihood of success. Two examples:

- Student background - the previous econometric analysis published 2013 showed that students from more affluent backgrounds are more likely to achieve successful outcomes. Therefore, a college that draws a larger proportion of its students from more affluent backgrounds should perform better. For example, approximately $40 \%$ of NWRC enrolments are from the most deprived wards in NI (i.e. in the bottom quintile) compared to just $10 \%$ for SERC.
- Subjects delivered - the previous econometric analysis has shown that students studying retail and leisure subjects are more likely to gain a successful outcome (irrespective of the college they attended) compared to those students studying science and mathematics subjects. Therefore, a college which has higher proportionate enrolment numbers in retail and leisure subjects should perform better than a college which has higher proportionate science and maths enrolments. For example, BMC has over 6.2\% enrolments studying science and mathematics subjects, compared to just $1.29 \%$ in SWC.
5.6. The purpose of conducting a logit regression analysis is to understand if the performance difference identified in Figure 5.1 above can be explained by the other factors (listed in paragraph 4.8) and to compare college performance on a like for like assessment.
5.7. Figure 5.2 below sets out the difference in performance between colleges adjusted for these factors (South West College has, again, been selected as the reference college). A comparison with the unadjusted data is also provided.

Figure 5.2: Percentage difference from SWC in success rates by college (2012/13 to 2014/15 - Unadjusted and Adjusted data)


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. A score of zero should be interpreted as meaning the likelihood of observing a successful outcome for a final year enrolment is no more (or less) likely than the reference college.
2. South West College has been selected as the reference college.
5.8. After adjusting for other characteristics, differentials in performance remain but the following observations are made:

- The gap between the best and worst performing colleges has narrowed significantly from 9.2 p.p. (using the unadjusted data) to a relatively small difference of 5.4 p.p. (i.e. $+3.7 \%$ SRC and $-1.7 \%$ BMC, using the adjusted data);
- There is a convergence in success rates across all colleges. The differential in performance with the reference college is reduced in all cases;
- $\quad \mathrm{SRC}$ is still the best performing college.
5.9. Overall the analysis suggests that a student's likelihood of achieving a successful outcome is affected in a small way by the college they attend. Therefore, even if colleges had a similar student profile (gender, age, and social background) and delivered a similar subject mix (subject area and mode of study), a variance in success outcomes across the sector would continue to exist. However, it is also important to recognise that the likelihood of success may also be partially explained by other factors which are not captured in the data and are outside the control of colleges.
5.10. Furthermore, the results provided within this analysis are headline figures which take into account enrolments as a whole, but do not provide a further breakdown of these enrolments. It is recommended that further refinements are added to the model to allow for a more detailed analysis in future. For example, further research could be undertaken examining the role of retention and attainment in success performance, similarly assessing the differences in impact between full-time and part-time courses, and also subject enrolments data compared to aggregated data for an individual student. A preliminary analysis on the performance of full-time enrolments compared to part-time enrolments has been included in Annex 3. This preliminary analysis tentatively suggests that, after adjusting for other characteristics, there may be some differences between college outcomes on a full time and part time basis (see Annex 3). For example, BMC records a better performance (controlling for other factors) on a full time course basis when compared to other colleges with part time performance less favourable.
5.11. The remaining analysis, conducted across the independent variables listed in paragraph 4.8 above, has been undertaken using the adjusted data only. This will identify the individual impact of each of the characteristics on the likelihood of success.


## Impact of the subject mix studied

5.12. The previous econometric research published in 2013 highlighted that the likelihood of a successful outcome varied across subjects studied. That research indicated that retail and leisure related courses had higher success rates than average and science \& maths and language courses had lower success rates.
5.13. Figure 5.3 below shows the results from the econometric analysis for the years 2012/13 to 2014/15 combined.

- Each subject is compared against a reference subject, in this case Health, Public Services and Care;
- A score of zero should be interpreted as meaning the likelihood of observing a successful outcome for a final year enrolment is no more (or less) likely than the reference subject area.

Fig 5.3: Impact of subject area on successful outcome (2012/13-2014/15) ${ }^{1}$


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. Health, Public Services and Care has been selected as the reference subject area.
5.14. A number of similar trends can be seen emerging:

- Enrolments for 'Retail \& commercial enterprise' are more likely to produce successful outcomes (+2.7 p.p.) compared to the reference subject area (Health, Public Services and Care), after controlling for other characteristics included in the analysis (refer to paragraph 4.8).
- Subjects such as 'History, philosophy and theology', 'Science and Mathematics' and 'Social Sciences' are less likely to deliver successful outcomes (-21.1 p.p., -21.0 p.p. and -15.7 p.p. respectively) compared to the reference subject.
5.15. This econometric analysis cannot explain the reasons for variations in subject level success rates. Individual colleges may wish to explore potential reasons within their institution and a comparison of results with similar subject areas (where possible) in schools may show similar trends.

Impact of the level (e.g. NQF Level) and mode (i.e. full-time and parttime) of study
5.16. The level of study (e.g. by NQF level) and mode of study (i.e. Full-time [FT] or Part-time [PT]) also have an impact on the likelihood of a successful outcome, even after adjustment to allow for a more like-for-like comparison. Figure 5.4 shows the results of the latest analysis on the impact of the level of study on successful outcomes.

Fig 5.4: Impact of the level and mode of study on successful outcome (2012/13 - 2014/15)


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1: Level 1 has been selected as the reference level (level of study)
2: PT study has been selected as the reference mode (mode of study)
3. A score of zero should be interpreted as meaning the likelihood of observing a successful outcome is no more (or less) likely than the reference level of study
5.17. The previous econometric analysis indicated that Level 2 study has had the lowest likelihood of success. However, these results would suggest that Level 1 (the reference level) has had the lowest likelihood of success in the last three years. As the level of study increases with the exception of entry level, so does the likelihood of success.
5.18. The previous econometric analysis indicated that full-time study was associated with a higher likelihood of a successful outcome. These results show that the previous trend has continued and students on full-time study have a greater likelihood of success than those studying part-time (by approximately 4.1 p.p.).

## Impact of age on a successful outcome

5.19. The analysis is based on three age groups: those aged 14-19, 20-24 and $25+$. The previous econometric analysis indicated that age did NOT have a significant impact on the likelihood of achieving a successful outcome. However, the latest analysis found that those aged 20-24 had a marginally lower likelihood of success relative to the reference age group (14-19). Those aged $25+$ had the same likelihood of success to the reference age group.

Fig 5.5: Impact of age on a successful outcome (2012/13-2014/15 ) ${ }^{1}$


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. Those aged 14-19 have been selected as the reference age group

## Impact of gender and urban/rural dwelling on a successful outcome

5.20. The previous econometric analysis indicated that gender did NOT have a significant impact on the likelihood of achieving a successful outcome. This analysis shows that females had a higher likelihood of success (1.0 p.p.), albeit only marginal.
5.21. The analysis also shows that controlling for all other factors, a student from an 'urban' area is less likely to achieve a successful outcome than a student from a rural area (by 2.9 p.p.). Figure 5.6 shows these results.

Fig 5.6: Impact of gender and urban/rural on a successful outcome (2012/13 - 2014/15)


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. Male is the reference gender
2. Rural is the reference area

Impact of disability (self-reported) on a successful outcome
5.22. The latest analysis, in line with the previous econometric analysis, has indicated that disability did NOT have a significant impact on the likelihood of achieving a successful outcome (compared to those not self-reporting as disabled) after controlling for other factors.

## Impact of social background/ deprivation on a successful outcome

5.23. Enrolments are categorised (by home postcode) into deprivation quintiles, from Dep 1 (the most deprived area) to Dep 5 (the least deprived area) based on the Northern Ireland Multiple Deprivation Measure (2010). The previous econometric analysis indicated that those living in the most deprived super output areas are least likely to succeed and those living in the least deprived wards are most likely to succeed. This was not surprising, but the percentage point difference between those living in the most and least deprived areas was very narrow. This suggested that the access policies and pastoral care offered within the FE sector had an impact in keeping the gap to a relatively low level.
5.24. Figure 5.7 below shows the results based on the 2012/13 to 2014/15 enrolment data.

Fig 5.7: Impact of social background on successful outcome (2012/13 2014/15) ${ }^{1}$


[^8]5.25. The trend from the previous econometric analysis has continued and students from the most deprived backgrounds are the least likely to achieve a successful outcome, with a gap at 5.2 p.p.

## Impact of ethnicity and marital status on a successful outcome

5.26. Previous analysis has indicated that 'white' students are marginally more likely to succeed compared to otherwise identical final year enrolments of 'non-white' ethnicity. The previous analysis also indicated that those who are married have the highest likelihood of success, compared to those who are single or are widowed/divorced or separated. Figure 5.8 below shows the results from the latest (2012/13 to 2014/15) data enrolment analysis.

Fig 5.8: Impact of ethnicity and marital status on a successful outcome (2012/13-2014/15) $)^{1,2}$


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. 'Widowed/divorced or separated' is the reference marital status
2. 'Non-white' is the ethnicity reference
5.27. These results are similar to the previous econometric analysis. Those classified as 'white' are 1.4 p.p. more likely to achieve success, and married students have the highest likelihood of success (5.2 p.p.) relative to 'Widowed/divorced or separated’ students and 'Single’ students have a 2.8 p.p. greater likelihood of success relative to 'Divorced/ Widowed' students.

## Impact of employment status (self-reported) on a successful outcome

5.28. The previous econometric analysis indicated that final year enrolments 'in employment' were more likely to have a successful outcome than someone unemployed. Furthermore, those in full-time employment were more likely to achieve a successful outcome than those in part-time employment.
5.29. That trend has continued in the latest data, where those in full-time employment have the highest likelihood of success (4.5 p.p. higher than unemployed), followed by those who have identified themselves as 'inactive ${ }^{15}$, and then those working part-time.
5.30. Figure 5.9 below shows the results from the $2012 / 13$ to 2014/15 data enrolment analysis.

Fig 5.9: Impact of employment status on a successful outcome ${ }^{1}$ (2012/13-2014/15)


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note: 1. Unemployed is the reference employment status

[^9]
## Impact of dependents on a successful outcome

5.31. The analysis found that having dependents had only a very limited impact on achieving a successful outcome. Those with adult dependents were 2.4 p.p. less likely to achieve a successful outcome (compared to those with no adult dependents) and those with child dependents were 0.7 p.p. more likely to achieve a successful outcome (compared to those with no child dependents). Figure 5.10 below shows the results from the analysis.

Fig 5.10: Impact of dependents on a successful outcome (2012/132014/15) ${ }^{1}$


Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
Note:1. No adult or child dependents is the reference dependents status

## 6. Summary

6.1. DfE in partnership with Ulster University has developed an econometric model to analyse the variability in success outcomes in the FE sector on a more 'like for like' basis. The regression model offers a more sophisticated method to scrutinise the raw data, compared to drawing conclusions from the raw data only.
6.2. The latest analysis of the final year enrolments on regulated courses combining academic years 2012/13 to 2014/15 has provided more longitudinal insight into the characteristics most likely to affect successful outcomes across the FE sector. Based on the results it can be concluded that a student with the following characteristics will be more likely to succeed:

- attend Southern Regional College;
- study a Retail and Commercial enterprise subject area;
- study a subject a Level 4 or above;
- study on a full-time basis;
- from a rural area;
- from a less deprived area;
- being married; and
- being full-time employed (or inactive).
6.3. The following characteristics have been identified as having only a limited impact on achieving a successful outcome:
- age;
- gender;
- ethnic background; and
- having dependents.
6.4. It is intended that this analysis will assist colleges to: shape curriculum plans; identify and address weaknesses and risk areas; shape student support and pastoral care; and identify/learn from best practice across the sector.
6.5. However, it must be stressed that this analysis does not replace existing mechanisms for assessing performance or student support programmes but is intended to provide a further source of evidence to inform action to improve a student's chances of success.


## Annex 1 - (Logistic) Regression Analysis at 5\% level of significance Interpreting the statistics

A positive (or negative) coefficient estimate indicates that the probability of "success" rises (or falls) with an increase in the value of the variable associated with the coefficient. However, the coefficient estimates do not provide a guide to the amount by which the probability of success increases or decreases in consequence of a change in the variable value.

For this reason, the estimation results are discussed in terms of "marginal probabilities" shown in the third column of the table as $d y / d x$. The marginal probability of "success", associated with a determining variable (e.g., gender, age, college) is the change in the probability of "success" consequent upon a unit change in the determining variable, the values of the other variables remaining unchanged (held at their mean values). For discrete variables ${ }^{16}$, the marginal probabilities refer to changes consequent upon a move from the residual (or reference) category ${ }^{17}$ for that variable to the category in question ${ }^{18}$.

So, for example, compared to an otherwise identical final year enrolment, an urban domiciled enrolment is 2.9 percentage points less likely to have a successful outcome. This result is significant at the $95 \%$ level. Significance levels tell us the extent to which the result is due to chance. In this instance, there is a $95 \%$ chance of the result being true and, conversely, only a 5\% chance of it not being true. The 90\% threshold is generally accepted as the minimum standard in the academic literature.

In this analysis, variables are said to be significant when they are statistically significant at the $5 \%$ level or higher, i.e. the $z$-value is greater than $\pm 1.96$. Given the number of observations within the analysis (over 210,000), the t-distribution converges tightly to the normal distribution - i.e. the critical value is 1.95998 as opposed to 1.95996 .

[^10]Table 1: (Logistic) Regression Analysis - Results (statistically significant variables) 2012/13-2014/15

| Residual Variable | Variable | $d y / d x^{19}$ | Std. Err. | Z | $\mathrm{P}>\|\mathrm{z}\|$ | 95\% Confidence interval |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to male | Female | 0.98 | 0.00177 | 5.52 | 0 | 0.006301 | 0.01324 |
| Compared to 14-19 | 20-25 year old | -3.12 | 0.00274 | -11.4 | 0 | -0.0366 | -0.025873 |
| Compared to non-white | White | 1.44 | 0.00507 | 2.85 | 0.004 | 0.004506 | 0.02439 |
| Compared to Widowed \& Divorced | Single | 2.79 | 0.00502 | 5.55 | 0 | 0.018016 | 0.037689 |
|  | Married | 5.21 | 0.00412 | 12.62 | 0 | 0.043981 | 0.060147 |
| Compared to no child dependent | Child dependent | 0.74 | 0.00277 | 2.67 | 0.008 | 0.001952 | 0.012801 |
| Compared to no adult dependent | Adult dependent | -2.41 | 0.0049 | -4.92 | 0 | -0.033706 | -0.014504 |
| Compared to unemployed | Full-time emp | 4.54 | 0.00251 | 18.07 | 0 | 0.040466 | 0.050312 |
|  | Part-time emp | 1.67 | 0.0022 | 7.59 | 0 | 0.012379 | 0.020994 |
|  | Inactive | 3.87 | 0.0021 | 18.42 | 0 | 0.034556 | 0.042786 |
| Compared to Deprivation Quintile 5 (least deprived) | Dep1 (most deprived) | -5.20 | 0.00317 | -16.40 | 0 | -0.058231 | -0.045798 |
|  | Dep2 | -4.07 | 0.00307 | -13.26 | 0 | -0.046739 | -0.034699 |
|  | Dep3 | -1.77 | 0.00307 | -5.76 | 0 | -0.023698 | -0.011661 |
|  | Dep4 | -0.83 | 0.00301 | -2.75 | 0.006 | -0.014189 | -0.002383 |
| Compared to rural domicile | Urban domicile | -2.91 | 0.00189 | -15.39 | 0 | -0.032776 | -0.02537 |
| Compared to Level 1 study | Entry level | 1.15 | 0.00338 | 3.41 | 0.001 | 0.004906 | 0.018148 |
|  | Level 2 | 3.78 | 0.00232 | 16.28 | 0 | 0.033271 | 0.042376 |
|  | Level 3 | 5.68 | 0.00278 | 20.41 | 0 | 0.051339 | 0.062246 |
|  | Level 4 plus | 10.34 | 0.00323 | 32.06 | 0 | 0.097117 | 0.109766 |
| Compared to part-time study | Full time study | 4.10 | 0.00256 | 16.04 | 0 | 0.036033 | 0.046065 |

[^11]| Residual Variable | Variable | $\mathrm{dy} / \mathrm{dx}{ }^{20}$ | Std. Err. | Z | $\mathrm{P}>\|\mathrm{z}\|$ | 95\% Confi Residu | ce interval ariable |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to Health, public services and care | Science and mathematics | -21.00 | 0.00665 | -31.57 | 0 | -0.222995 | -0.196925 |
|  | Construction | -2.82 | 0.00663 | -4.25 | 0 | -0.041186 | -0.01518 |
|  | ICT | -6.87 | 0.00481 | -14.28 | 0 | -0.078133 | -0.05927 |
|  | Retail and commercial enterprise | 2.71 | 0.00399 | 6.80 | 0 | 0.019287 | 0.03492 |
|  | Leisure, travel and tourism | -2.86 | 0.00626 | -4.56 | 0 | -0.040833 | -0.016284 |
|  | Arts, media and publishing | -4.36 | 0.00605 | -7.20 | 0 | -0.055415 | -0.03171 |
|  | History, philosophy and theology | -21.08 | 0.01501 | -14.04 | 0 | -0.240216 | -0.181371 |
|  | Social sciences | -15.73 | 0.00902 | -17.44 | 0 | -0.175023 | -0.139665 |
|  | Languages, literature and culture | -14.32 | 0.00642 | -22.30 | 0 | -0.155782 | -0.130608 |
|  | Education and training | -9.56 | 0.00538 | -17.78 | 0 | -0.106111 | -0.085035 |
|  | Preparation for life and work | -1.41 | 0.00397 | -3.55 | 0 | -0.021902 | -0.006328 |
|  | Business, administration and law | -9.55 | 0.00563 | -16.98 | 0 | -0.106579 | -0.084517 |
| Compared to studying in 12/13 | Studying in 13/14 | -1.18 | 0.00222 | -5.30 | 0 | -0.016133 | -0.007429 |
|  | Studying in 14/15 | 0.51 | 0.00219 | 2.35 | 0.019 | 0.000847 | 0.009441 |
| Compared to South West College | BMC | -1.65 | 0.00303 | -5.44 | 0 | -0.022443 | -0.01056 |
|  | NWRC | 1.41 | 0.00326 | 4.34 | 0 | 0.007765 | 0.020533 |
|  | SERC | 3.25 | 0.00281 | 11.55 | 0 | 0.027002 | 0.038036 |
|  | SRC | 3.68 | 0.00286 | 12.86 | 0 | 0.031212 | 0.042434 |

${ }^{20}$ Figures used for charts in analysis
Annex 2: Mean value comparison of variables in full and reduced dataset (2012/13 to 2014/15)21
Table 1: Differences in retention, achievement and success rates

| Variable | Full FELS \& CDR Dataset 2012/13 2014/15 <br> (Population size 363,333) |  | Reduced FELS \& CDR Dataset 2012/13 - 2014/15 (for modelling) <br> (Sample size 257,241) |  | Difference in rate (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Rate | No. of Observations | Rate |  |
| No. final year enrolments (A) | 363,333 | - | 257,241 | - |  |
| No. final year completers (B) | 324,438 | - | 228,508 | - |  |
| Retention rate (B/A) |  | 89.3\% |  | 88.8\% | -0.5pp |
|  |  |  |  |  |  |
| No. of Achievements - full and partial (C) | 284,509 |  | 200,191 |  |  |
| Achievement rate (C/B) |  | 87.7\% |  | 87.6\% | -0.1pp |
| Success Rate (B/A*C/B) |  | 78.3\% |  | 77.8\% | -0.5pp |

${ }^{21}$ Differences in rate/mean may not add due to rounding
Table 2: Differences in success rates, by FE college

| Variable | Full FELS \& CDR Dataset 2012/13 2014/15 <br> (Population size 363,333) |  | Reduced FELS \& CDR Dataset 2012/13 - 2014/15 (for modelling) <br> (Sample size 257,241) |  | Difference in rate (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Rate | No. of Observations | Rate |  |
| Success by FE college |  |  |  |  |  |
| BMC | 83,001 (22.8\% of full dataset) | 73.8\% | $\begin{aligned} & 53,635(20.9 \% \text { of full } \\ & \text { dataset) } \end{aligned}$ | 72.6\% | -1.2pp |
| NRC | $\begin{aligned} & 45,313(12.5 \% \text { of full } \\ & \text { dataset) } \end{aligned}$ | 76.2\% | $\begin{aligned} & \text { 40,534 (15.8\% of full } \\ & \text { dataset) } \end{aligned}$ | 77.3\% | 1.1pp |
| NWRC | 43,775 (12.1\% of full dataset) | 78.7\% | $\begin{aligned} & \text { 28,284 (11.0\% of full } \\ & \text { dataset) } \end{aligned}$ | 78.6\% | -0.2pp |
| SERC | $\begin{aligned} & 74,703 \text { (20.6\% of full } \\ & \text { dataset) } \end{aligned}$ | 80.9\% | $53,435(20.8 \%$ of full dataset) | 80.6\% | -0.3pp |
| SRC | $\begin{aligned} & \text { 67,008 (18.4\% of full } \\ & \text { dataset) } \end{aligned}$ | 83.0\% | $\begin{aligned} & \text { 42,436 (16.5\% of full } \\ & \text { dataset) } \end{aligned}$ | 81.7\% | -1.3pp |
| SWC | $\begin{aligned} & 49,533 \text { ( } 13.6 \% \text { of full } \\ & \text { dataset) } \end{aligned}$ | 77.2\% | $\begin{aligned} & 38,917 \text { (15.1\% of full } \\ & \text { dataset) } \end{aligned}$ | 77.0\% | -0.2pp |
| Sector total |  | 78.3\% |  | 77.8\% | -0.5pp |

Table 3: Differences in means, independent variables

| Variable | Full FELS \& CDR Dataset 2012/13 2014/15 <br> (Population size 363,333) |  | Reduced FELS \& CDR Dataset 2012/13 2014/15 (for modelling) <br> (Sample size 257,241) |  | Difference means in (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Mean Value | No. of Observations | Mean Value |  |
| Gender |  |  |  |  |  |
| Female | 187,166 | 50.5\% | 133,148 | 51.8\% | 1.2pp |
| Male | 183,652 | 49.5\% | 124,093 | 48.2\% | -1.2pp |
| Sector total | 363,333 | 100\% | 257,241 | 100\% |  |
| Age |  |  |  |  |  |
| Young | 204,184 | 56.2\% | 148,908 | 57.9\% | 1.7pp |
| Mid | 48,280 | 13.3\% | 34,582 | 13.4\% | 0.2pp |
| Old | 110,653 | 30.5\% | 73,751 | 28.7\% | -1.8pp |
| Sector total | 363,333 | 100\% | 257,241 | 100\% |  |
| Adult dependents |  |  |  |  |  |
| Adult dependents | 9,816 | 2.7\% | 8,488 | 3.3\% | 0.6pp |
| No adult dependents | 353,517 | 97.3\% | 248,753 | 96.7\% | -0.6pp |
| Sector total | 363,333 | 100\% | 257,241 | 100.0\% |  |


| Variable | Full dataset |  | Reduced dataset |  | Difference in means (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Mean Value | No. of Observations | Mean Value |  |
| Child dependents |  |  |  |  |  |
| Child dependents | 34,938 | 9.6\% | 30,213 | 11.8\% | 2.1pp |
| No child dependents | 328,395 | 90.4\% | 227,028 | 88.3\% | -2.1pp |
| Sector total | 363,333 | 100\% | 257,241 | 100\% |  |
| Aim of qualification |  |  |  |  |  |
| Studying entry level | 32,646 | 9.0\% | 20,157 | 7.8\% | -1.2pp |
| Studying level 1 | 57,119 | 15.8\% | 42,096 | 16.4\% | 0.6pp |
| Studying level 2 | 179,644 | 49.6\% | 127,384 | 49.5\% | -0.1pp |
| Studying level 3 | 74,898 | 20.7\% | 54,773 | 21.3\% | 0.6pp |
| Studying level 4 or higher | 18,071 | 5.0\% | 12,831 | 5.0\% | 0.0pp |
| Sector total | 362,378* | 100\% | 257,241 | 100\% |  |
| *955 missing observations (0.3\%) missing observations |  |  |  |  |  |
| Full time study | 54,312 | 15.0\% | 40,897 | 15.9\% | 1.0pp |
| Part time study | 309,021 | 85.1\% | 216,344 | 84.1\% | -0.9pp |
| Sector total | 363,333 | 100.0\% | 257,241 | 100\% |  |


| Variable | Full dataset |  | Reduced dataset |  | Difference in means (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Mean Value | No. of Observations | Mean Value |  |
| Ethnicity |  |  |  |  |  |
| White | 316,903 | 97.2\% | 250,643 | 97.5\% | 0.2pp |
| Non-white | 9,010 | 2.8\% | 6,569 | 2.6\% | -0.2pp |
| Sector total | 325,913* | 100\% | 257,212 ${ }^{22}$ | 100.0\% |  |
| *37,420 missing observations (10.3\%) missing observations |  |  |  |  |  |
| Single | 243,716 | 82.3\% | 211,917 | 82.4\% | 0.1pp |
| Married | 42,849 | 14.5\% | 36,861 | 14.3\% | -0.1pp |
| Divorced/Widowed | 9,695 | 3.3\% | 8,463 | 3.3\% | 0.0pp |
| Sector total | 296,260* | 100.0\% | 257,241 | 100.0\% |  |
| Disability |  |  |  |  |  |
| Disability | 47,137 | 13.0\% | 33,969 | 13.2\% | 0.2pp |
| No disability | 316,196 | 87.0\% | 223,272 | 86.8\% | -0.2pp |
| Sector total | 363,333 | 100\% | 257,241 | 100\% |  |

${ }^{22}$ Figure does not match the overall figure of 257,241 as there are 12 uncoded observations, which as a result cannot be dropped from the dataset

| Variable | Full dataset |  | Reduced dataset |  | Difference inmeans(percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | No. of Observations | Mean Value | No. of Observations | Mean Value |  |
| Employment status |  |  |  |  |  |
| Employed full time | 43,885 | 14.5\% | 39,049 | 15.2\% | 0.7pp |
| Employed part time | 53,791 | 17.7\% | 49,533 | 19.3\% | 1.5pp |
| Inactive | 80,276 | 26.5\% | 61,169 | 23.8\% | -2.7pp |
| Unemployed | 125,225 | 41.3\% | 107,490 | 41.8\% | 0.5pp |
| Sector total | 303,177* | 100\% | 257,241 | 100\% |  |
| *60,156 missing observations (16.6\%) missing observations |  |  |  |  |  |
| Community background |  |  |  |  |  |
| Catholic | 128,155 | 46.8\% | 106,936 | 45.8\% | -1.0pp |
| Protestant | 118,860 | 43.4\% | 103,421 | 44.3\% | 0.9pp |
| Other community | 26,806 | 9.8\% | 23,153 | 9.9\% | 0.1 pp |
| Sector total | 273,821 | 100\% | 233,510 ${ }^{23}$ | 100\% |  |
| * 89,512 missing observations (24.6\%) missing observations - removed from regression analysis |  |  |  |  |  |

${ }^{23}$ Figure does not match the overall figure of 257,241 as this variable was excluded from the regression analysis therefore missing observations were not dropped

| Variable | Full dataset |  | Reduced dataset |  | Difference means in (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Mean Value | No. of Observations | Mean Value | No. of Observations |  |
| Domicile |  |  |  |  |  |
| Urban domicile | 225,553 | 64.1\% | 163,894 | 63.7\% | -0.4pp |
| Rural domicile | 126,135 | 35.9\% | 93,347 | 36.3\% | 0.4pp |
| Sector total | 351,688* | 100\% | 257,241 | 100.0\% |  |
| *11,645 missing observations (3.2\%) missing observations |  |  |  |  |  |
| Social class - level of deprivation |  |  |  |  |  |
| Deprivation quintile 1 (most deprived) | 76,923 | 21.9\% | 55,404 | 21.5\% | -0.3pp |
| Deprivation quintile 2 | 80,689 | 22.9\% | 60,080 | 23.4\% | 0.4pp |
| Deprivation quintile 3 | 75,020 | 21.3\% | 54,758 | 21.3\% | 0.0pp |
| Deprivation quintile 4 | 67,216 | 19.1\% | 49,650 | 19.3\% | 0.2pp |
| Deprivation quintile 5 (last deprived0 | 51,819 | 14.7\% | 37,349 | 14.5\% | -0.2pp |
| Sector total | 351,667* | 100.0\% | 257,241 | 100.0\% |  |
| *11,666 missing observations (3.2\%) missing observations |  |  |  |  |  |


| Variable | Full dataset |  | Reduced dataset |  | Difference in means (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Mean Value | No. of Observations | Mean Value | No. of Observations |  |
| Subject studied (SSA tier 1) |  |  |  |  |  |
| Health, public services and care | 30,702 | 8.5\% | 22,244 | 8.7\% | 0.2pp |
| Science and mathematics | 13,517 | 3.7\% | 10,775 | 4.2\% | 0.5pp |
| Agriculture, horticulture and animal care | 2,393 | 0.7\% | 1,790 | 0.7\% | 0.0pp |
| Engineering and manufacturing technologies | 19,079 | 5.3\% | 12,568 | 4.9\% | -0.4pp |
| Construction, planning and the built environment | 10,966 | 3.0\% | 7,765 | 3.0\% | 0.0pp |
| Information and communication technology | 39,811 | 11.0\% | 27,931 | 10.9\% | -0.1pp |
| Retail and commercial enterprise | 37,514 | 10.3\% | 26,628 | 10.4\% | 0.0pp |
| Leisure, travel and tourism | 11,764 | 3.2\% | 8,505 | 3.3\% | 0.1pp |
| Arts, media and publishing | 14,632 | 4.0\% | 10,104 | 3.9\% | -0.1pp |
| History, philosophy and theology | 1,728 | 0.5\% | 1,302 | 0.5\% | 0.0pp |
| Social sciences | 5,625 | 1.6\% | 4,358 | 1.7\% | 0.1pp |
| Languages, literature and culture | 18,549 | 5.1\% | 13,491 | 5.2\% | 0.1 pp |
| Education and training | 32,022 | 8.8\% | 22,485 | 8.7\% | -0.1pp |
| Preparation for life and work | 103,911 | 28.6\% | 71,436 | 27.8\% | -0.9pp |
| Business, administration and law | 20,908 | 5.8\% | 15,859 | 6.2\% | 0.4pp |
| Sector total | 363,121* | 100\% | 257,241 | 100\% |  |
| *212 missing observations (0.1\%) missing observations |  |  |  |  |  |


| Variable | Full dataset |  | Reduced dataset |  | Difference in means (percentage points) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Mean Value | No. of Observations | Mean Value | No. of Observations |  |
| Qualification level upon entry |  |  |  |  |  |
| Level 0 (entry level) | 80,020 | 28.2\% | 53,697 | 23.8\% | -4.3pp |
| Level 1 | 9,949 | 3.5\% | 7,911 | 3.5\% | 0.0pp |
| Level 2 | 135,768 | 47.8\% | 113,594 | 50.4\% | 2.6pp |
| Level 3 | 43,377 | 15.3\% | 36,978 | 16.4\% | 1.1pp |
| Level 4 | 2,427 | 0.9\% | 2,086 | 0.9\% | 0.1pp |
| Level 5 | 8,254 | 2.9\% | 7,332 | 3.3\% | 0.3pp |
| Level 6 | 3,022 | 1.1\% | 2,621 | 1.2\% | 0.1 pp |
| Level 7 | 1,103 | 0.4\% | 937 | 0.4\% | 0.0pp |
| Level 8 | 207 | 0.1\% | 127 | 0.1\% | 0.0pp |
| Sector total | 284,127* | 100\% | 225,283 ${ }^{24}$ | 100\% |  |
| *79,206 missing observations (21.8\%) missing observations - removed from regression analysis |  |  |  |  |  |

${ }^{24}$ Figure does not match the overall figure of 257,241 as this variable was excluded from the regression analysis therefore missing observations were not dropped
Annex 3: Preliminary analysis on the performance of full-time versus part-time enrolments
Table 1: Part time enrolments analysis

| Residual Variable | Variable | $d y / d x$ | Std. Err. | Z | $P>\|z\|$ | 95\% Confidence interval |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to male | Female | 1.07 | 0.0020 | 5.52 | 0 | 0.0069 | 0.0146 |
| Compared to 14-19 | 20-25 year old | -3.12 | 0.0031 | -10.04 | 0 | -0.0373 | -0.0251 |
| Compared to non-white | White | 1.76 | 0.0055 | 3.18 | 0.001 | 0.0068 | 0.0285 |
| Compared to Widowed \& Divorced | Single | 2.85 | 0.0053 | 5.41 | 0 | 0.0181 | 0.0388 |
|  | Married | 5.59 | 0.0044 | 12.73 | 0 | 0.0473 | 0.0645 |
| Compared to no child dependent | Child dependent | 0.796 | 0.0030 | 2.65 | 0.008 | 0.0021 | 0.0138 |
| Compared to no adult dependent | Adult dependent | -2.72 | 0.0054 | -5.01 | 0 | -0.0378 | -0.0165 |
| Compared to unemployed | Full-time emp | 4.95 | 0.0027 | 18.13 | 0 | 0.0442 | 0.0549 |
|  | Part-time emp | 1.69 | 0.0025 | 6.86 | 0 | 0.0121 | 0.0218 |
|  | Inactive | 4.32 | 0.0023 | 18.49 | 0 | 0.0387 | 0.0478 |
| Compared to Deprivation Quintile 5 (least deprived) | Dep1 (most deprived) | -5.28 | 0.0035 | -15.08 | 0 | -0.0597 | -0.0460 |
|  | Dep2 | -4.45 | 0.0034 | -13.07 | 0 | -0.0511 | -0.0378 |
|  | Dep3 | -2.00 | 0.0034 | -5.88 | 0 | -0.0267 | -0.0133 |
|  | Dep4 | -1.01 | 0.0033 | -3.03 | 0.002 | -0.0167 | -0.0036 |
| Compared to rural domicile | Urban domicile | -2.67 | 0.0021 | -12.66 | 0 | -0.0309 | -0.0226 |
| Compared to Level 1 study | Entry level | 1.09 | 0.0036 | 3.06 | 0.002 | 0.0039 | 0.0179 |
|  | Level 2 | 4.16 | 0.0025 | 16.58 | 0 | 0.0367 | 0.0466 |
|  | Level 3 | 4.99 | 0.0032 | 15.66 | 0 | 0.0436 | 0.0561 |
|  | Level 4 plus | 8.67 | 0.0042 | 20.68 | 0 | 0.0785 | 0.0949 |


| Residual Variable | Variable | dy/dx | Std. Err. | Z | $P>\|z\|$ | 95\% Confidence interval |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to Health, public services and care | Science and mathematics | -23.74 | 0.0076 | -31.26 | 0 | -0.2523 | -0.2225 |
|  | ICT | -8.71 | 0.0057 | -15.24 | 0 | -0.0983 | -0.0759 |
|  | Retail and commercial enterprise | 3.01 | 0.0047 | 6.38 | 0 | 0.0209 | 0.0393 |
|  | Arts, media and publishing | -8.22 | 0.0083 | -9.93 | 0 | -0.0984 | -0.0659 |
|  | History, philosophy and theology | -20.95 | 0.0154 | -13.62 | 0 | -0.2396 | -0.1793 |
|  | Social sciences | -14.85 | 0.0102 | -14.62 | 0 | -0.1684 | -0.1286 |
|  | Languages, literature and culture | -15.67 | 0.0071 | -22.16 | 0 | -0.1706 | -0.1429 |
|  | Preparation for life and work | -11.23 | 0.0061 | -18.53 | 0 | -0.1242 | -0.1005 |
|  | Education and training | -2.50 | 0.0046 | -5.43 | 0 | -0.0340 | -0.0160 |
|  | Business, administration and law | -11.09 | 0.0066 | -16.86 | 0 | -0.1238 | -0.0980 |
| Compared to studying in 12/13 | Studying in 13/14 | -1.40 | 0.0025 | -5.59 | 0 | -0.0189 | -0.0091 |
|  | Studying in 14/15 | 0.59 | 0.0025 | 2.39 | 0.017 | 0.0011 | 0.0108 |
| Compared to South West College | BMC | -2.06 | 0.0033 | -6.16 | 0 | -0.0271 | -0.0140 |
|  | NWRC | 2.76 | 0.0036 | 7.64 | 0 | 0.0205 | 0.0347 |
|  | SERC | 4.09 | 0.0031 | 13.33 | 0 | 0.0349 | 0.0469 |
|  | SRC | 3.29 | 0.0032 | 10.36 | 0 | 0.0267 | 0.0391 |

Table 2: Full time enrolments analysis

| Residual Variable | Variable | dy/dx | Std. Err. | Z | $\mathrm{P}>\|\mathrm{z}\|$ | 95\% Confidence interval |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to male | Female | 1.75 | 0.0043 | 4.04 | 0 | 0.0090 | 0.0260 |
|  | Aged-20-24 | -4.30 | 0.0058 | -7.40 | 0 | -0.0544 | -0.0316 |
| Compared to 14-19 years old | Aged 25 and over | -1.84 | 0.0092 | -2.01 | 0.0450 | -0.0364 | -0.0004 |
|  | Full-time emp | 2.13 | 0.0077 | 2.76 | 0.006 | 0.0062 | 0.0364 |
| Compared to unemployed | Part-time emp | 1.35 | 0.0046 | 2.95 | 0.003 | 0.0045 | 0.0224 |
|  | Inactive | 1.33 | 0.0047 | 2.85 | 0.004 | 0.0042 | 0.0225 |
| Compared to Deprivation Quintile 5 (least | Dep1 (most deprived) | -4.49 | 0.0073 | -6.16 | 0 | -0.0592 | -0.0306 |
| deprived) | Dep2 | -2.15 | 0.0069 | -3.13 | 0.002 | -0.0349 | -0.0080 |
| Compared to rural domicile | Urban domicile | -3.86 | 0.0040 | -9.57 | 0 | -0.0465 | -0.0307 |
|  | Entry level | 12.57 | 0.0116 | 10.87 | 0 | 0.1030 | 0.1483 |
| Compared to Level 1 study | Level 3 | 4.01 | 0.0095 | 4.22 | 0 | 0.0215 | 0.0587 |
|  | Level 4 plus | 10.58 | 0.0061 | 17.31 | 0 | 0.0938 | 0.1177 |
|  | Science and mathematics | -6.06 | 0.0110 | -5.52 | 0 | -0.0821 | -0.0391 |
|  | Agriculture \& animal care | 2.88 | 0.0135 | 2.13 | 0.033 | 0.0023 | 0.0554 |
|  | Engineering \& manf | 1.56 | 0.0070 | 2.24 | 0.025 | 0.0020 | 0.0293 |
| Compared to Health, public services and | Construction | -3.01 | 0.0092 | -3.28 | 0.001 | -0.0481 | -0.0121 |
| care | Retail and commercial enterprise | 2.06 | 0.0059 | 3.52 | 0 | 0.0091 | 0.0320 |
|  | Arts, media and publishing | 1.98 | 0.0063 | 3.13 | 0.002 | 0.0074 | 0.0323 |
|  | Languages, literature and culture | -13.18 | 0.0177 | -7.43 | 0 | -0.1666 | -0.0970 |
|  | Education and training | -13.74 | 0.0346 | -3.97 | 0 | -0.2052 | -0.0696 |


|  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Compared to South West College | BMC | 1.49 | 0.0072 | 2.06 | 0.04 | 0.0007 | 0.0291 |
|  | NRC | -2.78 | 0.0075 | -3.72 | 0 | -0.0425 | -0.0132 |
|  | NWRC | -2.39 | 0.0076 | -3.15 | 0.002 | -0.0388 | -0.0090 |
|  | SERC | -1.72 | 0.0077 | -2.25 | 0.025 | -0.0322 | -0.0022 |
|  | SRC | 6.60 | 0.0062 | 10.67 | 0 | 0.0539 | 0.0782 |

## Further information:

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[^0]:    ${ }^{1}$ The analysis is restricted to the factors identified and recorded in the enrolment datasets.

[^1]:    ${ }^{4}$ Regulated enrolments are regarded as those on courses that are at 'level 3 or below' and appear on the ${ }_{5}$ Register of Regulated Qualifications (RRQ). They exclude recreational courses.
    ${ }^{5}$ Page 49

[^2]:    ${ }^{6}$ Source: DEL "Further Educations Activity in Northern Ireland 2010/11 to 2014/15 tables (excel)" (table A17). Inclusive of unknown postcodes.

[^3]:    ${ }^{7}$ Partial achievement is recorded when: the qualification for which a student has enrolled has not been achieved in full, but when either (a) a student achieves a certified component of the intended qualification - for example, a QCF Award instead of a QCF Certificate, or a QCF Certificate instead of a QCF Diploma; or (b) if a student does not achieve a certified component of the intended qualification, but still achieves $50 \%$ or more of the intended qualification - for example, $50 \%$ or more of the QCF units. It should be noted that $50 \%$ or more of QCF qualifications is based on units achieved and not on credits, because even though credits would be a more accurate measure of achievement, credit information is not readily available to colleges from the examination results provided by awarding organisations. 'Partial' achievement represents a small proportion of overall success - around 6\% in 2014/15.
    ${ }^{8}$ Source: DEL "Further Educations Activity in Northern Ireland 2010/11 to 2014/15 tables (excel)" (table 5)
    ${ }^{9}$ Academic year 2012/13
    ${ }^{10}$ Academic years 2013/14-2014/15

[^4]:    ${ }^{11}$ Other variables included in the dataset are: funding group, final year completer, final year achiever, Qualifications on entry, Community background

[^5]:    ${ }^{12}$ A contributing factor to the increase in the sample dataset is the removal of independent variables qualifications on entry and community background from the analysis. The inclusion of these variables would have reduced the dataset to $\mathrm{c} 57 \%$.

[^6]:    ${ }^{13}$ The Wald test is a way of testing the significance of particular explanatory variables in a statistical model
    Source of definition - http://www.blackwellpublishing.com/specialarticles/jcn_10_774.pdf

[^7]:    ${ }^{14} \mathrm{https}: / / \mathrm{www}$. delni.gov.uk/sites/default/files/publications/del/What\%20Factors\%20Contribute\%20to\% 20Successful\%20\%28Northern\%20Ireland\%29\%20Student\%20Outcomes\%20in\%20Further\%20Edu cation\%20An\%20Econometric\%20Analysi.pdf

[^8]:    Sources: Further Education Leavers Survey (FELS) 2012/13 and Consolidated Data Return (CDR) 2013/14 \& 2014/15
    Note: 1. Dep 5 (least deprived area) is the reference quintile

[^9]:    ${ }^{15}$ The ONS definition of 'economically inactive' are those without a job and have not actively sought work in the last four weeks, and/or are not available to start work in the next two weeks. It is typically made up of those who are looking after family members, early retired, students and those who are sick.

[^10]:    ${ }^{16}$ A variable that takes values from a finite or countable set, in this case the outcome is success (or not).
    ${ }^{17}$ The residual categories for the variables are defined in the notes.
    $\frac{\partial \operatorname{Pr}\left(Y_{i}=1\right)}{\partial X_{i k}}$ and reported in the tables as $d y / d x$

[^11]:    ${ }^{19}$ Figures used for charts in analysis

