

# **Associations between characteristics of students (ABCS) 2021**

**Annexes** 

Reference OfS 2021.46

Enquiries to Paula Duffin at official.statistics@officeforstudents.org.uk

Publication date 13 October 2021

## **Contents**

| Annex A: Modelling methodology                                |        |
|---|--------|
| Annex B: Characteristic definitions                           | 3      |
| Age   | 3      |
| Care experience   | 3      |
| Disability  | 3      |
| Ethnicity   | 3      |
| FSM eligibility   | 4      |
| IDACI   | 4      |
| IMD   | 4      |
| Local or distance learner                                     | 5      |
| NS-SEC  | 5      |
| Parental higher education                                     | 5<br>6 |
| Sex and gender School types                                   | 6      |
| TUNDRA  | 7      |
| Annex C: ABCS Access – statistical model and results          | 8      |
| The model   | 8      |
| Model results   | 11     |
| Annex D: ABCS FT continuation – statistical model and results | 12     |
| The model   | 12     |
| Model results   | 15     |
| Annex E: ABCS PT continuation – statistical model and results | 16     |
| The model   | 16     |
| Model results   | 18     |

### **Annex A: Modelling methodology**

- 1. The ABCS modelling methodology uses a binary logistic regression model with all characteristics forced in as main effects and every two-way interaction between categories tested using a stepwise regression method with entry and stay criteria of  $\alpha$ =0.05. This decides which of the two-way interactions are included in the final model.
- 2. We have carried out some sensitivity analysis to determine if it was viable to run the models with fewer years of data rather than the full five-years' worth. We ran all three models with three- and four-years' worth of data and compared the resulting numbers of groups in each quintile with the numbers of groups in each quintile having run with the five years of data. The majority of groups remained in the same quintile whichever time series was used and the small proportions that had changed quintile tended to move up or down by only one quintile, with very few changing by more than this. By this method we were also able to see the number of groups that were placed into quintiles using the full five years of data that simply didn't exist when using only three of four years of data, as no students had these combinations of characteristics across these years. The numbers of these groups were significant, especially in the case of the FT continuation model, although absolute numbers of students in these groups were small. For this reason, we have chosen to continue running our models with five years of data in order to maximise the number of unique groupings that we derive quintiles for.
- 3. In the same way that we carried out the sensitivity analysis, we also compared the results from our three models with those from the last update in November 2020. Despite some minor changes to the methodology and rolling forward the data a year, the quintiles that are derived in this update are broadly the same as before. For access, 90.9 per cent of students remain in the same quintile as previously. A further 1.5 per cent hold characteristic combinations that had not been seen in previous years, and so comparison with previous quintiles wasn't possible. For FT continuation, 75.1 per cent of students are in the same quintile as previously. However, this is largely accounted for by the fact that 11.2 per cent of students held combinations of characteristics that had not been previously seen. All of the new student groups (where there are combinations of characteristics not previously seen) are very small, typically only including one or two students. PT continuation sits between the other two measures, with 85.7 per cent of students remaining in the same quintile as before.
- 4. Where student groups are in a different quintile in this latest update, the vast majority have only moved up or down by one quintile. This assures us that the minor changes to the methodology and rolling the time series forward by a year for each measure has not resulted in drastic changes to how student groups are split across the quintiles.

#### **Annex B: Characteristic definitions**

- The characteristics used are all based on variables available on the Department for Education's National Pupil Database (NPD), the Education and Skills Funding Agency's (ESFA's) individualised learner record (ILR) or the Higher Education Statistics Authority's (HESA's) student record or alternative provider (AP) student record.
- Income Deprivation Affecting Children Index (IDACI) and the Index of Multiple Deprivation (IMD) quintiles are obtained from the Ministry of Housing, Communities and Local Government (MHCLG) and are added to the NPD, ILR, HESA student and AP student records.<sup>1</sup>

#### Age

3. Age, as used in ABCS FT and PT continuation measures, is defined as the age of the student on the 31 August in the year in which they started their course. This is calculated using their birth date as reported on the ILR or HESA student or student alternative records. Age is not used as a characteristic in the access measure as the base population is already restricted to 18- and 19-year-olds.

#### Care experience

4. Care experience describes whether a student has ever spent time in the care of a local authority in England or Wales, or Health and Social Care Trust in Northern Ireland, or who has self-declared as being in care for three months or more. The data is collected on the HESA student record only. The definition and reporting of care experience is complex. For details of the data used, see <a href="www.hesa.ac.uk/collection/c19051/a/careleaver">www.hesa.ac.uk/collection/c19051/a/careleaver</a>. Care experience is only used as a characteristic in the FT continuation measure.

#### **Disability**

5. Disability information is only used from the ILR and HESA student and AP student records. Disability is self-reported by students. Details of the disability types used can be found under the IPDISABLETYPE section in OfS's 2021 Core Algorithms document.<sup>2</sup> Disability is used as a characteristic in the FT and PT continuation measures.

#### **Ethnicity**

6. Ethnicity is used as a characteristic in all three ABCS measures. Ethnicity information is taken from the NPD for the access measure and from the ILR and HESA student and AP student records for the continuation measures. For ABCS access we use the groupings as they are collected in the NPD, with the exception of Gypsy/Roma and Traveller of Irish

<sup>&</sup>lt;sup>1</sup> See www.gov.uk/government/statistics/english-indices-of-deprivation-2019

 $<sup>^2~{\</sup>sf See}~\underline{{\sf www.office} for students.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/}$ 

- heritage, which are combined to make a single group, since the groups are very small when separated.
- 7. For continuation, we use the detailed groupings that the OfS reports by. More detail can be found under the IPETHNICDETAIL section OfS's 2021 Core Algorithms document.<sup>3</sup>

#### **FSM** eligibility

- 8. FSM eligibility indicates whether the student was ever recorded as being eligible to receive free school meals in the six years prior to the March census date in their final year of key stage four (year 11). This characteristic is used in the access and FT continuation measures.
- 9. The data on free school meals eligibility is produced by the Department for Education (DfE) as part of the National Pupil Database (NPD) and was linked onto data in the ILR and HESA student and student alternative records.<sup>4</sup> For this analysis, the data is restricted to only those who attended a state-funded mainstream school and were under 21 at the start of their higher education studies.

#### **IDACI**

10. The Income Deprivation Affecting Children Index (IDACI) is used in all three ABCS measures. It measures the proportion of children under the age of 16 in low-income households for a particular area in England.<sup>5</sup> It is calculated at lower-layer super output area (LSOA) level and is a supplementary measure to the Index of Multiple Deprivation (IMD), and therefore has been constructed for the Ministry of Housing, Communities and Local Government (MHCLG) by Oxford Consultants for Social Inclusion (OCSI) and deprivation.org. In this analysis, we use IDACI quintiles, where the most deprived areas are in quintile 1 and the least deprived are in quintile 5. For pupils or students domiciled outside of England, the value is set to 'Unknown or N/A', and data is not presented in the interactive tools.

#### **IMD**

11. The Index of Multiple Deprivation (IMD) is a measure of levels of deprivation for a small area within England and is used in all three ABCS measures.<sup>6</sup> It is calculated at lower-layer super output area (LSOA) level and uses several different measures to determine levels of deprivation. They have been constructed for the Ministry of Housing, Communities and Local Government (MHCLG) by Oxford Consultants for Social Inclusion (OCSI) and deprivation.org. In our analysis, we use IMD quintiles, where the most deprived areas are in

<sup>&</sup>lt;sup>3</sup> See <u>www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/</u>

<sup>&</sup>lt;sup>4</sup> The DfE does not accept responsibility for any inferences or conclusions derived from the NPD data by third parties

<sup>&</sup>lt;sup>5</sup> See www.gov.uk/government/statistics/english-indices-of-deprivation-2019

<sup>&</sup>lt;sup>6</sup> See www.gov.uk/government/statistics/english-indices-of-deprivation-2019

quintile 1 and the least deprived are in quintile 5. For pupils or students domiciled outside of England, the value is set to 'Unknown or N/A', and data is not presented in the interactive tools.

#### Local or distance learner

12. Local learners are identified by comparing home travel to work area with study travel to work area, which are calculated from home postcode and study postcode respectively. Local students are those whose home address is in the same travel to work area as their provider. Distance learners are those who are not in attendance at the provider for the vast majority of their course. That is, they are studying at a distance from their provider. These definitions are based on IPSTUDYLOCTYPE described in our 2021 Core Algorithms document.<sup>7</sup> This characteristic is used in both continuation measures.

#### **NS-SEC**

- 13. NS-SEC classifies the socio-economic background of students.<sup>8</sup> For those students who are under 21 at the start of their course, NS-SEC is based on the occupation of their highest earning parent. For those students aged 21 or over at the start of their course, NS-SEC is based on the occupation of the student themselves prior to higher education. Occupations are coded using the Standard Occupation Classification (SOC) and then grouped further into these categories:<sup>9</sup>
  - a. Higher managerial, administrative and professional occupations
  - b. Intermediate occupations
  - c. Routine and manual occupations
  - d. Never worked and long-term unemployed.
- 14. It is only collected in the HESA student record and is only used in the FT continuation measure.

#### Parental higher education

15. Parental higher education is only collected in the HESA student record.<sup>10</sup> It gives the student's response to the question 'Do any of your parents have any higher education

<sup>&</sup>lt;sup>7</sup> See <u>www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/</u>

<sup>&</sup>lt;sup>8</sup> Data for this characteristic comes from the HESA variable SEC. See www.hesa.ac.uk/collection/c19051/a/sec

<sup>&</sup>lt;sup>9</sup> See section 7 Classes and collapses at <a href="https://www.ons.gov.uk/methodology/classificationsandstandards/otherclassifications/thenationalstatisticssocioecon">www.ons.gov.uk/methodology/classificationsandstandards/otherclassifications/thenationalstatisticssocioecon</a> <a href="https://omechassificationssecrebasedonsoc2010#classes-and-collapses">omicclassificationssecrebasedonsoc2010#classes-and-collapses</a>

<sup>&</sup>lt;sup>10</sup> Data for this characteristic comes from the HESA variable pared. See www.hesa.ac.uk/collection/c18051/a/pared

qualifications, such as a degree, diploma or certificate of higher education?'. HESA defines parents as 'natural parents, adoptive parents, step-parents or guardians who have brought you up.' It is only used in the FT continuation measure.

#### Sex and gender

16. The NPD record collects information on gender, where the only response possible is either male or female, and this is what is used for the ABCS access measure. In the ABCS FT and PT continuation measures, this data is taken from the ILR and HESA records, where the field is recorded as 'sex', and it is also possible to have the response 'other'. In the case of the FT continuation measure, there are sufficient students with this response to place them in their own group. In the PT continuation measure, to avoid unnecessarily discarding data from the statistical model and having a group that is too small to use, these responses are grouped in with males as their continuation rate is closest to theirs.

#### **School types**

- 17. School types are defined using the variable NFTYPE from the NPD. Our access model only includes schools that the Department for Education defines as 'state-funded mainstream' schools. This includes the following school types:
  - a. Academy 16-19 Converter
  - b. Academy 16-19 Sponsor Led
  - c. Academy converter
  - d. Academy Sponsor-led
  - e. City Technology College
  - f. Community School
  - g. Foundation School
  - h. Free School 16-19
  - i. Free School Mainstream
  - i. Free School Studio School
  - k. Free School UTC
  - I. Further Education Sector Institution
  - m. Voluntary Aided School
  - n. Voluntary Controlled School.

#### **TUNDRA**

18. TUNDRA (tracking underrepresentation by area) is an area-based measure that uses tracking of state-funded mainstream school pupils in England to calculate young participation.<sup>11</sup> It only applies to students under 21 at the start of their course. For those aged 21 or over, or for students domiciled outside of England, these are placed in the 'Unknown or N/A' group. TUNDRA has replaced POLAR4 in the ABCS access and FT continuation measures. It is not used in the PT continuation measure.

<sup>11</sup> See <u>www.officeforstudents.org.uk/data-and-analysis/young-participation-by-area/about-tundra/</u>

# Annex C: ABCS Access – statistical model and results

- 1. The access outcome measures the proportion of 18- or 19-year-olds entering higher education (sometimes referred to as young participation). Data regarding these students is taken from the DfE's National Pupil Database (NPD) from the summer in which they obtained their key stage four (KS4) qualifications most commonly GCSEs. We have then tracked these students through to the start of higher education, where we can determine whether they are in the higher education records two or three years later at the age of 18 or 19. This will capture any level or mode of undergraduate study.
- 2. We have taken data for pupils who obtained their KS4 qualifications in state-funded mainstream schools in the summers of 2012, 2013, 2014, 2015 and 2016 (that is, in the academic years 2011-12 to 2015-16) from the NPD. Using KS4 cohorts up to 2015-16 allows us to capture the most recent 18- and 19-year-old entrants into higher education in the academic year 2019-20. We use KS4 cohorts because they give almost complete coverage of all 16-year-olds in England. In addition, combining data from five cohorts allows us to carry out robust analysis, ensuring that there are sufficient students in each of the characteristic groups to allow us to carry out analysis regarding their access behaviour.
- 3. The model includes data on 2,738,955 school pupils, 1,140,660 of which entered higher education aged 18 or 19.

#### The model

4. We have used a binary logistic regression model to predict the probability of entering higher education. The model includes the following characteristics: ethnicity, FSM eligibility, gender, IDACI, IMD and TUNDRA. Table C1 shows the categories within each of the characteristics and the number and proportion of the students in the model who are in each of these categories.

Table C1: Characteristics in the ABCS access model

|                 |                             | Total number of individuals |          |
|-----------------|-----------------------------|-----------------------------|----------|
| Characteristic  | Category                    | in the five cohorts         | Per cent |
| Ethnicity       | Bangladeshi                 | 38,515                      | 1.4%     |
|                 | Chinese                     | 10,140                      | 0.4%     |
|                 | Indian                      | 66,120                      | 2.4%     |
|                 | Pakistani                   | 91,300                      | 3.3%     |
|                 | Any other Asian background  | 38,285                      | 1.4%     |
|                 | Black - African             | 79,430                      | 2.9%     |
|                 | Black Caribbean             | 37,240                      | 1.4%     |
|                 | Any Other Black Background  | 15,000                      | 0.6%     |
|                 | White - British             | 2,053,975                   | 75.0%    |
|                 | White - Irish               | 9,155                       | 0.3%     |
|                 | Any other white background  | 102,240                     | 3.7%     |
|                 | Gypsy, Roma or Traveller    | 5,210                       | 0.2%     |
|                 | White and Asian             | 22,675                      | 0.8%     |
|                 | White and black African     | 11,670                      | 0.4%     |
|                 | White and black Caribbean   | 35,365                      | 1.3%     |
|                 | Any other mixed background  | 36,750                      | 1.3%     |
|                 | Any other ethnic group      | 36,345                      | 1.3%     |
|                 | Refused or unknown          | 49,530                      | 1.8%     |
| FSM eligibility | Not eligible for FSM        | 2,006,940                   | 73.3%    |
|                 | Eligible for FSM            | 699,100                     | 25.5%    |
|                 | Unknown or N/A              | 32,910                      | 1.2%     |
| IDACI           | Quintile 1 (most deprived)  | 614,205                     | 22.4%    |
|                 | Quintile 2                  | 561,665                     | 20.5%    |
|                 | Quintile 3                  | 524,505                     | 19.2%    |
|                 | Quintile 4                  | 509,910                     | 18.6%    |
|                 | Quintile 5 (least deprived) | 491,310                     | 17.9%    |
|                 | Unknown or N/A              | 37,360                      | 1.4%     |
| IMD             | Quintile 1 (most deprived)  | 619,635                     | 22.6%    |
|                 | Quintile 2                  | 547,880                     | 20.0%    |
|                 | Quintile 3                  | 513,210                     | 18.7%    |
|                 | Quintile 4                  | 500,720                     | 18.3%    |
|                 | Quintile 5 (least deprived) | 520,150                     | 19.0%    |
|                 | Unknown or N/A              | 37,360                      | 1.4%     |
| Gender          | Female                      | 1,354,445                   | 49.5%    |

|                 | Male                           | 1,384,510 | 50.6% |
|-----------------|--------------------------------|-----------|-------|
| TUNDRA          | Quintile 1 (least represented) | 540,090   | 19.7% |
|                 | Quintile 2                     | 540,075   | 19.7% |
|                 | Quintile 3                     | 539,860   | 19.7% |
|                 | Quintile 4                     | 539,675   | 19.7% |
|                 | Quintile 5 (most represented)  | 539,665   | 19.7% |
|                 | Unknown or N/A                 | 39,595    | 1.5%  |
| Total number of |                                |           |       |
| individuals     |                                | 2,738,955 | 100%  |

5. Stepwise selection has been used to determine which two-way interactions to include in the model with entry and stay criteria of  $\alpha$ =0.05. This has resulted in the inclusion of the following interactions shown in table C2.

Table C2: Interactions in the ABCS access model

| Interactions              |
|---------------------------|
| Gender*FSM eligibility    |
| Gender*Ethnicity          |
| Gender*IMD                |
| Gender*TUNDRA             |
| Ethnicity*FSM eligibility |
| Ethnicity*IDACI           |
| Ethnicity*IMD             |
| Ethnicity*TUNDRA          |
| IDACI*FSM eligibility     |
| IMD*FSM eligibility       |
| IMD*IDACI                 |
| TUNDRA*FSM eligibility    |
| TUNDRA*IDACI              |
| TUNDRA*IMD                |

#### 6. The model is:

$$logit(\pi_i) = \beta_0 + \tilde{\beta}_1 ethnicity_i + \tilde{\beta}_2 IDACI_i + \tilde{\beta}_3 IMD_i + \tilde{\beta}_4 FSM_i + \tilde{\beta}_5 gender_i + \tilde{\beta}_6 TUNDRA_i + interactions$$

Where i is an individual,  $\pi_i$  is a binary response variable which takes the value of 1 if the individual accessed higher education aged 18 or 19 and 0 otherwise,  $\tilde{\beta}$  represents vectors of different sizes and the interactions are as listed above.

#### **Model results**

7. The coefficient estimates for each of the factors and for all the two-way interactions included in the final model can be found in the Excel/CSV files at <a href="https://www.officeforstudents.org.uk/publications/associations-between-characteristics-of-students-abcs-2021/">www.officeforstudents.org.uk/publications/associations-between-characteristics-of-students-abcs-2021/</a>

# Annex D: ABCS FT continuation – statistical model and results

- 1. Full-time continuation is measured one year and 14 days after a student starts their studies. Students are defined as continuing if they are continuing with or have completed their studies or have transferred to another higher education provider to continue their studies.<sup>12</sup>
- 2. We have used continuation data for UK-domiciled undergraduate students who started their courses between the academic years 2014-15 and 2018-19 and were studying full-time at an English provider. We have used data from the ILR and HESA student and student alternative records. Data regarding FSM eligibility has been taken from the NPD. Combining data from five cohorts allows us to carry out robust analysis, ensuring that there are enough students in each of the characteristic groups to allow us to carry out analysis regarding their continuation behaviour.
- 3. The model includes data on 2,079,440 students, 1,875,375 of which are recorded as continuing.

#### The model

4. We have used a binary logistic regression model to predict the probability of continuing in higher education. The model includes the following characteristics: age, care experience, disability, ethnicity, FSM eligibility, IDACI, IMD, local or distance learner, NS-SEC, parental education, sex and TUNDRA. Table D1 shows the categories within each of the characteristics and the number and proportion of the students in the model who are in each of these categories.

Table D1: Characteristics in the ABCS FT continuation model

|                 | Category             | Total number of<br>students in the<br>five cohorts | Per cent |
|-----------------|----------------------|--|----------|
| Age             | 18 and under         | 926,510  | 44.6%    |
|                 | 19                   | 431,090  | 20.7%    |
|                 | 20                   | 154,720  | 7.4%     |
|                 | 21-25                | 256,150  | 12.3%    |
|                 | 26-50                | 287,980  | 13.9%    |
|                 | 51+                  | 22,990   | 1.1%     |
| Care experience | Care experienced     | 12,725   | 0.6%     |
|                 | Not care experienced | 1,410,675  | 67.8%    |

<sup>&</sup>lt;sup>12</sup> For details of how we calculate continuation measures from the data, see the OfS Institutional performance measures: Regulatory indicators, methodology and rebuild instructions at <a href="https://www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/">https://www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/</a>

|                 | Unknown or N/A                           | 656,045   | 31.6% |
|-----------------|--|-----------|-------|
| Disability      | Cognitive or learning difficulties       | 119,395   | 5.7%  |
|                 | Mental health condition                  | 62,205    | 3.0%  |
|                 | Multiple or other impairments            | 44,265    | 2.1%  |
|                 | Sensory, medical or physical impairments | 44,715    | 2.2%  |
|                 | Social or communication impairment       | 15,335    | 0.7%  |
|                 | No disability reported                   | 1,793,520 | 86.3% |
| Ethnicity       | Asian or Asian British - Chinese         | 15,305    | 0.7%  |
|                 | Asian or Asian British - Indian          | 74,940    | 3.6%  |
|                 | Asian or Asian British - Pakistani       | 84,450    | 4.1%  |
|                 | Asian or Asian British - other           | 51,305    | 2.5%  |
|                 | Asian or Asian British – Bangladeshi     | 46,385    | 2.2%  |
|                 | Black or black British - African         | 152,345   | 7.3%  |
|                 | Black or black British - Caribbean       | 44,585    | 2.1%  |
|                 | Black or black British – other           | 12,515    | 0.6%  |
|                 | Mixed - other                            | 27,280    | 1.3%  |
|                 | Mixed - white and Asian                  | 27,805    | 1.3%  |
|                 | Mixed - white and black African          | 13,035    | 0.6%  |
|                 | Mixed - white and black Caribbean        | 27,405    | 1.3%  |
|                 | White                                    | 1,435,015 | 69.0% |
|                 | Gypsy or Traveller                       | 450       | 0.0%  |
|                 | Other ethnic group                       | 39,780    | 1.9%  |
|                 | Unknown or N/A                           | 26,850    | 1.3%  |
| FSM eligibility | Eligible for FSM                         | 222,790   | 10.7% |
|                 | Not eligible for FSM                     | 1,137,375 | 54.7% |
|                 | Unknown or N/A                           | 719,275   | 34.6% |
| IDACI           | Quintile 1 (most deprived)               | 407,035   | 19.6% |
|                 | Quintile 2                               | 406,590   | 19.6% |
|                 | Quintile 3                               | 382,725   | 18.4% |
|                 | Quintile 4                               | 383,545   | 18.4% |
|                 | Quintile 5 (least deprived)              | 427,495   | 20.6% |
|                 | Unknown or N/A                           | 72,050    | 3.5%  |
| IMD             | Quintile 1 (most deprived)               | 402,665   | 19.4% |
|                 | Quintile 2                               | 410,100   | 19.7% |
|                 | Quintile 3                               | 379,885   | 18.3% |
|                 | Quintile 4                               | 385,485   | 18.5% |
|                 | Quintile 5 (least deprived)              | 430,090   | 20.7% |
|                 | Unknown or N/A                           | 71,220    | 3.4%  |

| Local or distance         | p  |           |       |
|---------------------------|--|-----------|-------|
| learner                   | Distance   | 7,260     | 0.4%  |
|                           | Local  | 617,705   | 29.7% |
|                           | Neither  | 1,454,480 | 70.0% |
| NS-SEC                    | Higher managerial, administrative and professional occupations | 556,030   | 26.7% |
|                           | Intermediate occupations                                       | 261,530   | 12.6% |
|                           | Routine and manual occupations                                 | 310,450   | 14.9% |
|                           | Never worked and long-term unemployed                          | 6,185     | 0.3%  |
|                           | Unknown or N/A   | 945,245   | 45.5% |
| Parental higher education | Higher education qualification held by parent(s)               | 732,730   | 35.2% |
|                           | Higher education qualification not held by parent(s)           | 716,400   | 34.5% |
|                           | Unknown or N/A   | 630,315   | 30.3% |
| Sex                       | Female   | 1,164,215 | 56.0% |
|                           | Male   | 914,225   | 44.0% |
|                           | Other  | 1,005     | 0.1%  |
| TUNDRA                    | Quintile 1 (least represented)                                 | 166,970   | 8.0%  |
|                           | Quintile 2   | 223,625   | 10.8% |
|                           | Quintile 3   | 276,220   | 13.3% |
|                           | Quintile 4   | 341,380   | 16.4% |
|                           | Quintile 5 (most represented)                                  | 440,420   | 21.2% |
|                           | Unknown or N/A   | 630,830   | 30.3% |
| Total number of students  |  | 2,079,440 | 100%  |

5. Stepwise selection has been used to determine which two-way interactions to include in the model with entry and stay criteria of  $\alpha$ =0.05. This has resulted in the inclusion of the following interactions as shown in table D2.

Table D2: Interactions in the ABCS FT continuation model

| Interactions                              |
|---|
| FSM eligibility*Parental higher education |
| Age*FSM eligibility                       |
| Age*NS-SEC                                |
| Age*Care experience                       |
| Age*Parental higher education             |
| Care experience*NS-SEC                    |
| Ethnicity*NS-SEC                          |

| Ethnicity*Age                                       |
|---|
| Ethnicity*Care experience                           |
| Disability*FSM eligibility                          |
| Disability*Parental higher education                |
| Local or distance learner*FSM eligibility           |
| Local or distance learner*Age                       |
| Local or distance learner*Ethnicity                 |
| Local or distance learner*Disability                |
| Local or distance learner*Parental higher education |
| Parental higher education*NS-SEC                    |
| IDACI*FSM eligibility                               |
| IDACI*Age   |
| IDACI*Care experience                               |
| IDACI*Disability                                    |
| IMD*NS-SEC  |
| IMD*Ethnicity                                       |
| IMD*Local or distance learner                       |
| TUNDRA*Age  |
| TUNDRA*Ethnicity                                    |
| TUNDRA*Parental higher education                    |
| Sex*Ethnicity                                       |

#### 6. The model is:

```
\begin{split} logit(\pi_i) &= \beta_0 + \tilde{\beta}_1 age_i + \tilde{\beta}_2 \text{care experience}_i + \tilde{\beta}_3 disability_i + \tilde{\beta}_4 ethnicity_i \\ &+ \tilde{\beta}_5 FSM \ eligibility_i + \tilde{\beta}_6 IDACI_i + \tilde{\beta}_7 IMD_i + \tilde{\beta}_8 local \ or \ distance_i + \tilde{\beta}_9 NS - SEC_i \\ &+ \tilde{\beta}_{10} parental \ higher \ education_i + \tilde{\beta}_{11} sex_i + \tilde{\beta}_{12} TUNDRA_i + interactions \end{split}
```

where i is an individual,  $\pi_i$  is a binary response variable which takes the value of 1 if the individual continued into the second year of their course and 0 otherwise,  $\tilde{\beta}$  represents vectors of different sizes and the interactions are as listed above.

#### **Model results**

7. The coefficient estimates for each of the factors and for all the two-way interactions included in the final model can be found in the Excel/CSV files at <a href="https://www.officeforstudents.org.uk/publications/associations-between-characteristics-of-students-abcs-2021/">www.officeforstudents.org.uk/publications/associations-between-characteristics-of-students-abcs-2021/</a>

# Annex E: ABCS PT continuation – statistical model and results

- 1. Part-time continuation is measured two years and 14 days after a student starts their studies. Students are defined as continuing if they are continuing with or have completed their studies or have transferred to another higher education provider to continue their studies.<sup>13</sup>
- 2. We have used continuation data for UK-domiciled undergraduate students who started their courses between the academic years 2013-14 and 2017-18 and were studying part-time at an English provider. We have used data from the ILR and HESA student and student alternative records. Combining data from five cohorts allows us to carry out robust analysis, ensuring that there are enough students in each of the characteristic groups to allow us to carry out analysis regarding their continuation behaviour.
- 3. The model includes data on 437,420 students, 284,815 of which are recorded as continuing.

#### The model

4. We have used a binary logistic regression model to predict the probability of continuing in higher education. The model includes the following characteristics: age, disability, ethnicity, IDACI, IMD, local or distance learner and sex. Table E1 shows the categories within each of the characteristics and the number and proportion of the students in the model who are in each of these categories.

Table E1: Characteristics in the ABCS PT continuation model

| Characteristic | Category                           | Total number of<br>students in the<br>five cohorts | Per cent |
|----------------|------------------------------------|--|----------|
| Age group      | 18 and under                       | 18,545   | 4.2%     |
|                | 19                                 | 17,845   | 4.1%     |
|                | 20                                 | 19,785   | 4.5%     |
|                | 21-25                              | 100,010  | 22.9%    |
|                | 26-50                              | 251,850  | 57.6%    |
|                | 51+                                | 29,285   | 6.7%     |
|                | Unknown or N/A                     | 100  | 0.0%     |
| Disability     | Cognitive or learning difficulties | 15,715   | 3.6%     |
|                | Mental health condition            | 9,500  | 2.2%     |
|                | Multiple or other impairments      | 15,560   | 3.6%     |

<sup>&</sup>lt;sup>13</sup> For details of how we calculate continuation measures from the data, see the OfS Institutional performance measures: Regulatory indicators, methodology and rebuild instructions at <a href="https://www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/">https://www.officeforstudents.org.uk/data-and-analysis/institutional-performance-measures/technical-documentation/</a>

|                           | Sensory, medical or physical impairments | 10,085  | 2.3%  |
|---------------------------|--|---------|-------|
|                           | Social or communication impairment       | 1,350   | 0.3%  |
|                           | No disability reported                   | 385,215 | 88.1% |
| Ethnicity                 | Asian or Asian British - Chinese         | 1,315   | 0.3%  |
|                           | Asian or Asian British - Indian          | 8,500   | 1.9%  |
|                           | Asian or Asian British - Pakistani       | 6,175   | 1.4%  |
|                           | Asian or Asian British - other           | 6,885   | 1.6%  |
|                           | Asian or Asian British – Bangladeshi     | 2,200   | 0.5%  |
|                           | Black or black British - African         | 16,065  | 3.7%  |
|                           | Black or black British - Caribbean       | 8,175   | 1.9%  |
|                           | Black or black British – other           | 1,775   | 0.4%  |
|                           | Mixed - other                            | 3,655   | 0.8%  |
|                           | Mixed - white and Asian                  | 2,110   | 0.5%  |
|                           | Mixed - white and black African          | 1,405   | 0.3%  |
|                           | Mixed - white and black Caribbean        | 3,830   | 0.9%  |
|                           | White                                    | 361,300 | 82.6% |
|                           | Gypsy or Traveller                       | 85      | 0.0%  |
|                           | Other ethnic group                       | 4,620   | 1.1%  |
|                           | Unknown or N/A                           | 9,325   | 2.1%  |
| IDACI                     | Quintile 1 (most deprived)               | 75,445  | 17.3% |
|                           | Quintile 2                               | 82,895  | 19.0% |
|                           | Quintile 3                               | 82,410  | 18.8% |
|                           | Quintile 4                               | 78,650  | 18.0% |
|                           | Quintile 5 (least deprived)              | 73,185  | 16.7% |
|                           | Unknown or N/A                           | 44,840  | 10.3% |
| IMD                       | Quintile 1 (most deprived)               | 73,375  | 16.8% |
|                           | Quintile 2                               | 83,365  | 19.1% |
|                           | Quintile 3                               | 82,465  | 18.9% |
|                           | Quintile 4                               | 79,990  | 18.3% |
|                           | Quintile 5 (least deprived)              | 73,840  | 16.9% |
|                           | Unknown or N/A                           | 44,385  | 10.2% |
| Local or distance learner | Distance                                 | 201,895 | 46.2% |
|                           | Local                                    | 111,475 | 25.5% |
|                           | Neither                                  | 124,055 | 28.4% |
| Sex                       | Female                                   | 255,685 | 58.5% |
|                           | Male                                     | 181,740 | 41.6% |

| Total number of |         |      |
|-----------------|---------|------|
| students        | 437,420 | 100% |

5. Stepwise selection has been used to determine which two-way interactions to include in the model with entry and stay criteria of  $\alpha$ =0.05. This has resulted in the inclusion of the following interactions shown in table E2.

Table E2: Interactions in the ABCS PT continuation model

| Interactions                         |
|--------------------------------------|
| Ethnicity*Age                        |
| Ethnicity*Disability                 |
| Ethnicity*Local or distance learner  |
| Ethnicity*IDACI                      |
| Disability*Age                       |
| Disability*Local or distance learner |
| Local or distance learner*Age        |
| IDACI*Age                            |
| IDACI*Local or distance learner      |
| IMD*Age                              |
| IMD*Local or distance learner        |
| IMD*IDACI                            |
| Sex*Age                              |
| Sex*Ethnicity                        |
| Sex*Disability                       |
| Sex*Local or distance learner        |
| Sex*IDACI                            |
| Sex*IMD                              |

6. The model is:

$$\begin{split} logit(\pi_i) = \beta_0 + \tilde{\beta}_1 age_i + \tilde{\beta}_2 disability_i + \tilde{\beta}_3 ethnicity_i + \tilde{\beta}_4 IDACI_i + \tilde{\beta}_5 IMD_i \\ + \tilde{\beta}_6 local \ or \ distance_i + \tilde{\beta}_7 sex_i + interactions \end{split}$$

where i is an individual,  $\pi_i$  is a binary response variable which takes the value of 1 if the individual continued into the second year of their course and 0 otherwise,  $\tilde{\beta}$  represents vectors of different sizes and the interactions are as listed above.

#### **Model results**

7. The coefficient estimates for each of the factors and for all the two-way interactions included in the final model can be found in the Excel/CSV files at

 $\underline{www.office for students.org.uk/publications/associations-between-characteristics-of-\underline{students-abcs-2021/}$ 

