

# The association between graduates' field of study and occupational attainment in West Germany, 1980–2008

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**Abstract** Over the course of higher education expansion and growing numbers of graduates, employers are supposed to have increasing difficulties to regard a higher education degree as reliable signal for productivity. As a consequence, they may take into account 'qualitative' differences such as graduates' field of study more often than in previous times when hiring labour market entrants. Both from a supply- and demand-side perspective graduates from humanities, social services or arts may be increasingly disadvantaged in terms of labour market outcomes compared to graduates from science, technology, engineering and mathematics over time. The article tests this argumentation by assessing changes in the relationship between graduates' field of study and risk of unemployment as well as access to the service class in West Germany between 1980 and 2008. Changes in returns to field of study may contribute to growing (social) inequalities among graduates amidst educational expansion and are therefore important to consider. Based on Microcensus data, the results show that field of study differences in terms of both labour market outcomes did not increasingly diverge over time. The paper concludes that due to a limited educational expansion and the prevalence of an occupationally segmented labour market higher education remains a good investment in terms of labour market returns in West Germany irrespective of graduates' field of study.

**Keywords** Field of study · Higher education · Educational Expansion · Returns to Education · Germany

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## Der Zusammenhang zwischen Studienfach und beruflichem Erfolg von Hochschulabsolventen in Westdeutschland

**Zusammenfassung** Angesichts der Bildungsexpansion und der steigenden Zahl an Hochschulabsolventen erweist es sich für Arbeitgeber zunehmend als schwierig, einen Hochschulabschluss noch als zuverlässiges Signal für die Produktivität der Bewerber zu deuten. Eine These lautet daher, dass Arbeitgeber bei der Einstellung von Arbeitsmarktanfängern nunmehr verstärkt auf qualitative Unterschiede achten, etwa das Studienfach der Hochschulabsolventen. Demnach könnten Absolventen der Geistes- und Sozialwissenschaften künftig sowohl angebots- als auch nachfrageseitig gegenüber Absolventen aus den Natur- und Ingenieurwissenschaften und der Mathematik mit Blick auf deren Arbeitsmarktchancen zunehmend benachteiligt sein. Dieser Artikel überprüft dieses Argument, indem er die Veränderung des Zusammenhangs zwischen dem Studienfach der Absolventen und deren Arbeitsloskeitsrisiko sowie deren Zugang zur Dienstklasse (service class) in Westdeutschland für den Zeitraum von 1980 und 2008 untersucht. Veränderungen in den fachspezifischen Bildungsrenditen könnten demnach trotz des Ausbaus der Hochschulbildung zu steigender (sozialer) Ungleichheit zwischen Hochschulabsolventen führen. Die Ergebnisse, die auf Basis der Mikrozensusdaten erhoben wurden, zeigen, dass sich im Laufe der Zeit die Unterschiede zwischen den Studienfächern und den beiden Indikatoren für deren Arbeitsmarktp Performanz nicht signifikant geändert haben. Insgesamt zeigt sich, dass Hochschulbildung in Westdeutschland angesichts der bislang begrenzten Bildungsexpansion und des stark segmentierten Arbeitsmarktes weiterhin eine gute Investition darstellt – unabhängig vom gewählten Studienfach.

## 1 Introduction

The literature on social stratification increasingly paid attention to the impact of horizontal differentiations in postsecondary education on occupational attainment or earnings (for an overview see Gerber and Cheung 2008). Among these horizontal differentiations, the field of study is regarded as one of the key determinants of socio-economic inequality. Initial research in the US primarily looked at the mediating role of college major for the gender wage gap (e. g. Bobbitt-Zeher 2007; Brown and Corcoran 1997; Daymont and Andrisani 1984; Gerhart 1990). Further studies addressed the question why fields of study differ in labour market outcomes and associate these differences with specialization effects (Van de Werfhorst and Kraaykamp 2001; Klein 2011a; Paglin and Rufolo 1990; Shauman 2006) or stress the mediating role of job characteristics (Roksa 2005; Wolbers 2003). Other research was concerned with cross-national comparisons and how the institutional context shapes the association between fields of study and a variety of labour market outcomes (e. g. Giesecke and Schindler 2008; Kim and Kim 2003; Reimer and Steinmetz 2009; Van de Werfhorst 2004).

Despite this vast literature, changes in the association between graduates' field of study and labour market returns across time have been rarely investigated (for an exception see Gerber and Schaefer 2004 on Russia). Due to changes on the supply-side, i. e. educational expansion and on the demand-side, i. e. occupational upgrading and technological changes returns to different fields of study cannot be assumed to remain constant across periods. Changes in the labour market value of fields of study are consequential for trends in socio-economic inequalities and intergenerational social mobility. During educational expansion children from higher social background may increasingly feel the need to differentiate themselves from children from lower social background by choosing more frequently fields of study that involve higher rewards in the labour market (see "effectively maintained inequality" hypothesis, Lucas 2001). If these rewarding fields become more beneficial in terms of labour market outcomes over time compared to less rewarding fields, this development contributes to a widening socio-economic gap among graduates.

Both from a supply- and demand-side perspective there are reasons to argue that graduates' field of study has become more important in job allocation procedures over time. From a signalling perspective (Spence 1973), higher education qualifications may increasingly lose their signalling capacity in terms of potential productivity if more and more students are able to attain a degree in the course of higher education expansion. Employers may therefore take other observable indicators such as qualitative differences (field of study, higher education institution, final grade) into

account in order to differentiate between graduates in their hiring decisions. When higher education degrees become increasingly more unreliable during higher education expansion, employers are supposed to increasingly use graduates' field of study as selection criterion (Hansen; Jackson et al. 2005; Van de Werfhorst 2002). Reimer et al. (2008) suggest that amidst educational expansion increasingly untalented students would gain access to higher education and opt for the less academically challenging fields like humanities or social sciences, rather than STEM (science, technology, engineering and mathematics) fields. As a consequence, the signalling value of less demanding fields in the labour market would decline. The authors provide some support for their hypothesis: the higher the proportion of tertiary graduates in a country, the higher the relative unemployment risk for graduates from humanities.

From a demand-side perspective, amidst an increasing demand for high-skilled labour due to technological changes some fields of study may have more substantially profited from these occupational changes in terms of availability of appropriate graduate jobs than others. During occupational upgrading in West Germany administrative and managerial positions as well as technical expert positions have expanded more strongly than positions in social and cultural services (Klein 2011b). Some field of study groups (STEM fields, business) may have benefited from these compositional changes more than others (humanities, arts, social work) in terms of occupational attainment.

This article contributes to the literature by assessing changes in the relationship between graduates' field of study and labour market outcomes (risk of unemployment, access to service class positions) over time in West Germany. For the analysis I make use of a long series of large-scale German labour force surveys (Microcensus) between 1980 and 2008.

In the following, I present theoretical considerations on the relationship between field of study and labour market outcomes and its potential changes over time. Thereafter, I introduce the data and methods before showing the results. The article concludes with a discussion of the results.

## 2 Theoretical considerations

### 2.1 Educational expansion and compositional changes in the recruitment pool

From a human capital perspective, graduates from different fields of study acquire different competencies and skills during their studies (e. g. Van de Werfhorst and Kraaykamp 2001). Fields of study may differ in the provision of general academic skills, learning environments, the complexity of curricula or mathematical skills that are assumed to be

scarcer than other skills in the graduate population (Paglin and Rufolo 1990). Thus, some fields may provide students with more challenging and productive skills and knowledge than others.

Whether the acquisition of human capital during studies is rewarded in the labour market may depend on the demand for specific skills (Heijke et al. 2003). Some fields of study may produce more job-related skills and prepare students for specific occupations or occupational segments, whereas others mostly convey general skills and lack an occupational specific orientation (Noelke et al. 2012). Since job applicants that match the skill requirements of the job are more productive and require less training, they may have advantages in labour market returns over graduates from fields of study that rather convey general skills (Glebbeck et al. 1989).

In contrast to human capital theory, the signalling theory (Spence 1973; Stiglitz 1975) drops the unrealistic assumption of perfect information with regard to individuals' potential productivity. Employers have to rely on imperfect information and hire job applicants in uncertainty about their true productivity. Aside from the educational level employers use the field of study as signal for potential productivity. They rank graduates from different fields of study into a labour queue according to potential training costs and match it to a second queue of vacant jobs sorted by skill requirements (Thurow 1975). If students are able to complete the most challenging fields, they indicate lower training costs in the future and have a higher probability of fulfilling the requirements of a demanding job.

From a strict signalling perspective, one's field of study may not indicate a different acquisition of skills but rather signal differences in the graduate population in terms of pre-existing cognitive abilities, motivation or commitment (Davies and Guppy 1997; Ishida et al. 1997). The most capable students may select into and succeed in the most challenging fields, leading into occupational positions that involve the highest labour market returns. By contrast, less capable students may attempt to avoid failure by choosing less demanding fields of study with fewer labour market rewards.

Over the course of educational expansion, a tertiary degree may have become a less reliable productivity signal for employers (Jackson et al. 2005: 12; Van de Werfhorst 2002: 287; Hansen 2001: 210). This is because tertiary degrees offer a 'noisier' signal regarding applicants' unobservable attributes such as ability or motivation compared to former times. Amidst higher education expansion, employers may assume that the signalling costs for attaining higher education are less negatively correlated with individuals' productivity, as more and more individuals are able to acquire this signal (Spence 1973). Therefore, employers feel less certain whether a tertiary degree indicates job ap-

plicants' higher ability or motivation and therefore higher productivity compared to lower educational certificates. In order to identify the highly able and motivated students among the increasing pool of higher education graduates, employers may increasingly rely on signals such as the field of study (Dörfler and Van de Werfhorst 2009; Jackson et al. 2005). This may be because fields of study increasingly differ in terms of selectivity over time.

During educational expansion increasingly more untalented students are supposed to have gained access to higher education (Walker and Zhu 2005; Gebel and Pfeiffer 2007). At school level, Becker et al. (2006) find that 7<sup>th</sup> graders in upper secondary education (Gymnasium) show significantly lower average skills in mathematics at the beginning of the 1990s than at the end of the 1960s. In order to minimize the risk of drop out, the growing proportion of less able Abitur-holders may select into less academically challenging fields like humanities, social sciences or arts and, consequently, lower the average ability level of students in these fields. In contrast, due to the more demanding curriculum the ability levels of students in STEM fields may be less affected or remain rather unaffected during educational expansion (Reimer et al. 2008; Clark 1978). Accordingly, US students in STEM fields have been found to have higher math and verbal abilities than students from humanities, social sciences and business (Arcidiacono 2004). For Germany, Reimer and Pollak (2010) show that the better students' Abitur grades are the lower students' likelihood of studying humanities and social sciences in almost all school leaver cohorts across time. A decrease in students' average ability in less demanding fields may further involve a decline in teaching standards in curricula in those fields (Walker and Zhu 2005). This might additionally contribute to a devaluation of humanities, social sciences and arts in the labour market.

Given this scenario, the signalling value of tertiary degrees in humanities, social sciences, arts or social services in the labour market may have declined, while the signalling value of degrees in STEM fields continues to be as high as prior to higher education expansion. As a consequence, employers increasingly prefer graduates from academically demanding and more selective STEM fields over graduates from the less demanding and less selective fields of humanities, social sciences and arts in their hiring decisions over time.

## 2.2 Changes in the demand for graduates from different fields of study

From a demand-side perspective, skill-biased technological change (SBTC) predicts that the exogenous expansion of computer-based technology increased demand for high-skilled analytical, non-routine cognitive tasks in the labour

market (e. g. Autor et al. 1998; Acemoglu 2002). In addition, compositional shifts in the occupational structure may have increased or decreased the demand for particular fields of study.

In West Germany, the composition of graduate occupations has changed tremendously during occupational upgrading: high-skilled positions in social and cultural services (e. g. medical services, education, social work, services related to cultural activities in the arts, media etc.) have more slowly increased, while technical and particularly administrative and managerial positions increased with a faster rate (Klein 2011b). Hence, the share of high-skilled positions in social and cultural services has relatively decreased among the pool of graduate occupations and the share of technical, administrative and managerial positions has relatively increased. These compositional changes may imply that some fields of study have grown in demand, e. g. business and economics, science and mathematics, while other fields, e. g. humanities, social services and arts have become less demanded over time. In other words, the partial labour market for graduates from STEM fields and business has been growing, while it has been declining for graduates from humanities and social sciences.

Paglin and Rufolo (1990) assume that human capital based on mathematical ability is scarcer than human capital that is formed by verbal ability. Math and economic skills tend to have become increasingly important for all kinds of jobs (Mitra 2002). Accordingly, it was shown that math and science abilities predict salaries to a higher extent than in former times (Murnane et al. 1995). Therefore, graduates from STEM fields, economics and business may be increasingly demanded regardless of the partial labour market the vacancies are situated in. In contrast, graduates from humanities, social sciences and arts may have increasing difficulties to find employment in the high-skilled labour market due their lack of math skills.

Both from a supply and demand perspective I derive the *hypothesis* that graduates' field of study became increasingly relevant for early occupational attainment in the labour market over time. In particular, graduates from less academically challenging and less demanded fields of humanities, social sciences, arts or social services and education may have become more disadvantaged in terms of occupational attainment compared to graduates from the more academically challenging and more demanded STEM fields over time (*Hypothesis 1a*).

### 2.3 Channelling graduates into the workplace

According to labour market segmentation theories (e. g. Sørensen and Kalleberg 1981), the labour market is composed of a series of partial labour markets, which are not open to all job applicants alike. The German labour mar-

ket is known as prototypical case of an occupational labour market where job applicants are matched to jobs according to their occupation-specific credentials (Gangl 2003b; Marsden 1990). While this characterisation mainly refers to the German apprenticeship system, it is to some degree also valid for the link between higher education and the labour market (Leuze 2007).

Given the occupationally segmented labour market in West Germany, the signalling assumption of two national queues of job applicants and job vacancies seem to be an inappropriate approach for explaining differences in occupational attainment between graduates from different fields of study. Changes in selectivity in one field of study group and the accompanied occupational segment do not have any impact on graduates' job allocation in another field of study group and occupational segment. Field of study differences in labour market returns are mainly a matter of the degree of linkage between fields of study and occupational segments and field-specific supply-demand balances. While graduates from more general fields are worse off in terms of accessing appropriate graduate occupations due to their lack of occupation-specific skills at all times, graduates with occupation-specific skills may have more difficulties in case of an oversupply of graduates from their fields due to the lack of general skills and the restriction to particular occupational segments.

STEM fields teach occupation-specific skills and graduates from these fields are prepared for specialised technical and engineering labour markets. In these partial labour markets recruitment is strongly based on job applicants who graduated from the corresponding field of study. Successful labour market integration among these graduates thus depends on the pool of job openings in the corresponding occupational segment as well as the number of competitive candidates from the same field of study (Kriesi et al. 2010).

In contrast, graduates from humanities, social sciences and arts are taught rather general skills, have a less distinct occupational profile and therefore need to compete more often with graduates of occupation-specific fields and lower educated individuals about any available job vacancies in the high-skilled labour market (Klein 2011a). Accordingly, graduates from the professions and STEM fields are, in general, less likely to be in a mismatched occupation than other fields (Grotheer et al. 2012).

Returns to higher education are shaped by the relative evolution of higher education expansion and occupational upgrading in the labour market over time (Gangl 2003a). By international comparison higher education expansion has taken place on a rather moderate level in West Germany (OECD 2013; Müller and Wolbers, 2003). Likewise, the occupational upgrading of high-skilled occupational positions has more or less kept pace with higher education expansion (Oesch and Rodríguez Menés 2011; Klein 2011b).

Hence, the increasing number of graduates was able to find employment in appropriate graduate jobs and incidences of overeducation have not been dramatically increasing over time.

Although there might be short-term imbalances between supply and demand of graduates in some occupational segments, it is rather unlikely that there is a continuous trend towards increasing field of study differences in occupational attainment in West Germany over time. Given the occupationally segmented structure of the labour market, the modest educational expansion and sufficient occupational upgrading, *hypothesis 1b* argues that field of study differences in occupational attainment did not increasingly diverge over time.

### 3 Data, variables and methods

#### 3.1 Data and sample

For the analyses, I use a long series of German labour force surveys, the Microcensus, covering one per cent of the German households. The time series comprises the Microcensus Scientific-Use-Files (70 per cent random subsamples) 1980, 1985, 1987, 1989, 1991, 1993, 1995, 1996, 2000 and 2004–2008 and concentrates on the West German population. The sample is restricted to tertiary graduates differentiating between first-tier university and second-tier polytechnics (Fachhochschule) graduates.

The analysis focuses on labour market entrants because changes in the supply- and demand-side are more immediate with labour market entry cohorts (Gangl 2003a). Since the Microcensus lacks information on the first job, I approximated tertiary graduates' labour market entrance with the age group 30–34. In order to grasp the magnitude of higher education expansion and increasing graduate competition, the age group is slightly older than the typical graduation age. This is because a considerable proportion of German higher education students graduate well into their thirties (Müller and Wolbers 2003) and students increasingly graduate in later ages across birth cohorts (Hillmert and Jacob 2004).<sup>1</sup> Due to gender segregation in the German labour market, all analyses are conducted separately for men and women. The graduate sample across all Microcensus years is  $N = 30,889$  for men and  $N = 22,244$  for women.

#### 3.2 Variables

I use two indicators of occupational allocation as dependent variables: *access to the service class and risk of unemployment*. Both indicators have to be taken into account in order to fully capture changes in the relationship between graduates' field of study and labour market positions. During higher education expansion and structural shifts in the labour market graduates from humanities, arts and social sciences might not only be disadvantaged in attaining beneficial career positions but may have problems to find employment at all. Due the strong prevalence of occupationally segmented labour markets and the dual system of apprenticeship, graduates from fields providing rather general skills may have difficulties to compete with vocationally-qualified school-leavers around intermediate and lower occupational positions and may therefore become rather unemployed.

With slight modifications, the status of *unemployment* at the time of the interview is defined according to ILO convention: not working for a single hour during the reference week and actively seeking for a job in the last four weeks (ILO 2005). However, individuals that participate in school-based education are not considered as belonging to the labour force irrespective of their labour force status.

*Service class positions* are operationalized with the EGP-class schema (Erikson and Goldthorpe 1992) as EGP I and II using information on detailed occupation codes (German Klassifizierung der Berufe (KldB)) and employment status. EGP I includes higher-grade professionals, administrators, and officials, managers in large industrial establishments and large proprietors. EGP II contains lower-grade professionals, administrators, and officials, higher-grade technicians, managers in small industrial establishments and supervisors of non-manual employees.

The EGP class schema adheres closely a Weberian class concept, i.e. social classes are strictly formed by labour market relations and thus determine individuals' life chances by stratifying access to material resources. Service class positions (EGP I and II) are an appropriate indicator for graduates' occupational attainment since it involves a service relationship that offers the chance of steadily rising salaries throughout working life and long-term career success in exchange for employees' commitment to the organization and high job performance. These positions not only include a salary and various perquisites but also prospective elements such as promotion opportunities and security both in employment and after retirement. Service class positions offer 'well-defined career opportunities' (Erikson and Goldthorpe 1992: 42) and life course benefits, which can therefore be unequivocally regarded as hierarchically above all other classes (Erikson and Goldthorpe 1992: 46). The EGP-class schema involves high criterion validity

<sup>1</sup> Selecting tertiary graduates aged 25 to 34 would heavily underestimate the strength of educational expansion, as increasingly larger shares of younger students remain in tertiary education and thus exclude from the sample.

**Tab. 1** Higher education expansion and the distribution of fields of study (Percentages). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
Overall <sup>a</sup>	14	16	19	26	29	27	27	
Teaching	12	7	5	2	4	6	6	1681
Med./Pharm	9	8	9	8	6	5	5	2205
Law	7	6	5	5	5	6	5	1680
Science/Math	14	15	16	19	14	12	13	4640
Engineer./Agron	27	29	32	33	38	33	28	9589
Bus./Manag	16	18	21	23	22	27	28	7016
Hum./Soc./Arts	8	10	8	8	8	8	9	2656
Soc. Serv./Educ	8	7	5	3	3	4	4	1422
<i>N</i>	1725	4794	6753	5166	2468	4042	5941	30,889
<i>Women</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
Overall <sup>a</sup>	7	10	13	18	21	23	25	
Teaching	30	20	18	10	14	19	19	3905
Med./Pharm	10	8	10	11	10	7	8	1945
Law	2	4	5	5	5	6	7	1179
Science/Math	4	8	9	10	9	6	5	1646
Engineer./Agron	4	5	8	9	10	10	9	1858
Bus./Manag	6	10	14	18	19	24	23	3971
Hum./Soc./Arts	16	19	19	21	21	17	17	4158
Soc. Serv./Educ	27	26	19	15	12	12	11	3582
<i>N</i>	816	2850	4420	3473	1629	3408	5648	22,244

<sup>a</sup>Percentage of HE graduates (age 30–34) among all labour market entrants (Lower secondary education and below: age 20–24; upper secondary education: age 25–29)

capturing cleavages in job characteristics and benefits that it is supposed to capture (Goldthorpe and McKnight 2006).

To assess changes in the association between graduates' fields of study and occupational segments, the service class is further differentiated into three segments: (1) administrative and managerial positions such as managers, accountants or governmental and non-governmental administrators, (2) technical experts such as engineers or scientists and social and cultural services (3) such as medical services, education, social work, services related to cultural activities in the arts, media etc. (for a detailed classification see Tab. 7 in the appendix).

Respondents' *field of study* is measured with eight groups: teaching, law, medicine/pharmacy, humanities/social sciences/arts, social services/education, science/mathematics and engineering/agronomics and business and management (for a detailed classification see Tab. 8 in the appendix).

*Nationality* and *tertiary institution* are included as confounders in all models. *Nationality* is a binary indicator differentiating between German and non-German citizenship. *Tertiary institution* differentiates between universities and polytechnics (Fachhochschule).

### 3.3 Analytic strategy

Based on the pooled Microcensus sample, I conducted linear probability models (LPMs) for both outcomes of risk of unemployment and access to the service class. In order to model changes over time these models included interaction terms between field of study and seven periods: 1980, 1985–1987, 1989–1993, 1995/1996, 2000, 2004–2005 and 2006–2008. Comparing coefficients from non-linear probability models across samples is problematic since it is unclear whether differences in the effect of the predictor variable can be attributed to real differences or to differences in residual variation across models (Mood 2010). For the same reasons, I compare average marginal effects (AMEs) across survey years when differentiating the service class into four segments EGP I/II administrative and managerial, EGP I/II technical expert, EGP I/II social and cultural services and EGP III–VII) in separate multinomial logistic regressions.

**Tab. 2** Occupational upgrading and compositional changes (Percentages). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
EGP I/II admin./manag	6	7	9	13	17	17	17	13,969
EGP I/II technical experts	6	7	8	11	12	11	11	10,849
EGP I/II social services	7	7	6	8	7	8	8	8843
EGP III–VII	80	79	77	69	64	64	64	89,059
<i>N</i>	11,076	25,299	30,909	16,965	7518	12,360	18,593	122,720
<i>Women</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
EGP I/II admin./manag	5	6	7	12	13	14	14	10,163
EGP I/II technical experts	2	2	3	4	4	4	4	3260
EGP I/II social services	14	15	15	17	18	21	22	18,189
EGP III–VII	80	77	75	68	65	62	60	75,823
<i>N</i>	8928	21,576	27,332	14,662	6154	11,343	17,440	107,435

Sample of labour market entrants: lower secondary education and below: age 20–24; upper secondary education: age 25–29; HE graduates: age 30–34

## 4 Results

### 4.1 Changes in the recruitment pool of graduates

Tab. 1 shows the supply-side changes in terms of higher education expansion among all labour market entrants and the distribution of fields of study among graduates. The proportion of higher education graduates increased for both men and particularly women between 1980 and the end of the 2000s. However, in the last decade the expansion came to a standstill for men and only slightly increased for women.

The distribution of fields of study across sexes shows the well-known gender segregation in higher education. For men, engineering and science/mathematics as well as business/management are the most popular fields. Women opt more often for teaching, humanities/social sciences/arts and social services/education. The most salient change over time was the increase in the percentage of students in business and management studies for both sexes. In contrast, the percentage of individuals with teaching, medicine or social services/education degrees decreased over time.

### 4.2 Occupational upgrading and compositional changes

Tab. 2 shows demand-side changes in the labour market in terms of occupational upgrading and compositional changes in the occupational structure among labour market entrants over time. For both sexes, the share of occupational positions below the service class (EGP III–VII) substantially decreased particularly in the 1990s (from 80 % to 64 % and 60 % respectively). Hence, not only the supply of gradu-

ates increased but also the demand for high-skilled labour. When differentiating between segments of the service class, this increase in high-skilled positions took predominantly place in the administrative and managerial segment, more so for men than for women. While the share of individuals working in technical expert positions increased for men as well, an increase of social and cultural services positions contributed to the expansion of the service class for women.

Tab. 3 illustrates graduates' changing employment and occupational destinations over time. The 1980s have been the most problematic decade for higher education graduates in West Germany: both unemployment rate and proportion of graduates working in lower and intermediate occupational positions (EGP III–VII) increased for both sexes. Accordingly, this decade was characterised by an occupational upgrading that somewhat lagged behind HE expansion producing an oversupply of graduates (Klein 2011b). From the mid-1990s onwards the situation in the graduate labour market improved again and graduates' unemployment rate and percentage working below the service class decreased.

In line with compositional changes in the service class, the share of graduates working in the administrative and managerial service class segment substantially increased while the share of employees in the social and cultural services segment decreased. This may imply that graduates from business/management and STEM fields benefited more from occupational upgrading in terms of an increasing demand than graduates from humanities/social sciences/arts.

**Tab. 3** Graduates' employment and occupational destinations over time (Percentages). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
Unemployment rate	1	4	4	4	2	3	2	
<i>N</i>	1714	4748	6678	5115	2448	4005	5895	30603
EGP I/II	86	82	80	80	83	84	85	
EGP I/II segments								
Admin./manag	17	22	25	26	32	33	34	
Technical experts	30	30	32	34	33	32	29	
Social services	39	31	23	20	18	19	21	
EGP III–VII	15	18	19	20	17	16	16	
<i>N</i>	1691	4544	6401	4876	2386	3845	5707	29,450
<i>Women</i>	1980	1985–87	1989–93	1995–96	2000	2004–05	2006–08	<i>N</i>
Unemployment rate	3	8	8	6	4	5	4	
<i>N</i>	642	2326	3578	2912	1441	2926	4937	18,762
EGP I/II	88	84	77	78	80	82	82	
EGP I/II segments								
Admin./manag	5	11	15	20	21	25	26	
Technical experts	3	6	10	11	13	12	11	
Social services	79	67	52	47	45	45	46	
EGP III–VII	12	16	23	22	20	18	18	
<i>N</i>	624	2135	3279	2716	1387	2772	4728	17,641

Sample restricted to HE graduates: age 30–34

### 4.3 Graduates' field of study and occupational destinations over time

Tab. 4 shows the relationship between graduates' field of study and unemployment risk over time for both sexes separately. The column '1980' shows the main effects of the field of study compared to the reference category science and mathematics in the pooled linear probability model. The following columns indicate changes in the effect of field of study on the probability of unemployment across different periods (interaction terms between field of study and period).

Graduates from different fields of study do not significantly differ in their probability of being unemployed compared to graduates from science and mathematics in 1980. There are also no consistent developments in the association between field of study and unemployment over time. Changes are rather volatile and unsystematic. Even though there was a more problematic period in terms of overall graduate unemployment in the 1980s until mid-1990s, graduates from different fields of study seem to have been similarly affected by joblessness. There is clearly no continuously increasing unemployment gap between different fields of study across periods.

Tab. 5 shows the results for the association between field of study and access to managerial and professional occupations over time. As for unemployment risks, there are no substantial differences between fields of study in occupational attainment. The only exception are graduates from

business and management. Both female and male graduates from these studies have a significantly lower probability of gaining access to the service class than graduates from all other fields. Since business and management studies are more practically oriented, they may have stronger links to routine non-manual employment in administration and commerce rather than to traditional graduate occupations. Over time, graduates from business and management were able to reduce their disadvantages in terms of accessing the service class to all other groups. For male graduates from business, this change has been significant at the 1%-level compared to graduates from science/mathematics from the mid-1990s onwards. This may indicate that business and management graduates are increasingly demanded in the course of compositional occupational changes in the high-skilled labour market. Still, they remain strongly disadvantaged compared to other fields in terms of occupational attainment.

For men, there is no consistent trend in the gap between humanities/social sciences/arts and social services/education and STEM fields in access to the service class across periods. Female graduates from humanities/social sciences/arts and social services/education became somewhat more disadvantaged in accessing managerial and professional occupations compared to female graduates in



**Tab. 4** Graduates' field of study and unemployment risk over time (linear probability model). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men (N = 30,603)</i>	1980	1985–1987	1989–1993	1995/1996	2000	2004–2005	2006–2008
Ref. Science/Mathematics							
Medicine/Pharmacy	–0.00 (0.01)	–0.01 (0.01)	–0.03* (0.01)	–0.01 (0.02)	–0.00 (0.02)	0.01 (0.02)	0.00 (0.01)
Teaching	0.01 (0.01)	0.01 (0.02)	0.00 (0.02)	0.00 (0.03)	–0.00 (0.02)	–0.01 (0.02)	–0.01 (0.02)
Law	0.01 (0.01)	0.01 (0.02)	–0.03 (0.02)	–0.01 (0.02)	0.02 (0.02)	0.01 (0.02)	–0.00 (0.02)
Engineering/Agronomics	–0.00 (0.01)	0.00 (0.01)	–0.02 (0.01)	–0.01 (0.01)	–0.00 (0.01)	0.02 (0.01)	0.00 (0.01)
Business/Management	0.01 (0.01)	–0.02 (0.01)	–0.04** (0.01)	–0.01 (0.01)	–0.02 (0.01)	–0.01 (0.01)	–0.01 (0.01)
Humanities/Social sciences/Arts	0.00 (0.01)	0.05* (0.02)	0.01 (0.02)	0.00 (0.02)	–0.00 (0.02)	0.03 (0.02)	0.02 (0.02)
Social services/Education	0.03 (0.02)	0.03 (0.03)	0.00 (0.03)	–0.05* (0.02)	0.00 (0.03)	0.01 (0.03)	–0.02 (0.02)
<i>Women (N = 18,762)</i>	1980	1985–1987	1989–1991	1995/1996	2000	2004–2005	2006–2008
Ref. Science/Mathematics							
Medicine/Pharmacy	–0.01 (0.04)	–0.02 (0.05)	–0.00 (0.05)	–0.05 (0.05)	0.06 (0.05)	0.00 (0.05)	0.00 (0.05)
Teaching	0.00 (0.04)	–0.05 (0.05)	0.01 (0.04)	–0.06 (0.04)	–0.01 (0.04)	–0.04 (0.04)	–0.02 (0.04)
Law	0.04 (0.08)	–0.08 (0.09)	–0.06 (0.08)	–0.06 (0.08)	–0.01 (0.08)	–0.02 (0.08)	–0.04 (0.08)
Engineering/Agronomics	–0.05 (0.04)	–0.00 (0.05)	0.05 (0.04)	0.01 (0.04)	0.07 (0.04)	0.05 (0.04)	0.06 (0.04)
Business/Management	–0.01 (0.05)	–0.04 (0.06)	–0.01 (0.05)	–0.07 (0.05)	0.01 (0.05)	–0.02 (0.05)	–0.00 (0.05)
Humanities/Social sciences/Arts	–0.01 (0.04)	–0.05 (0.05)	0.02 (0.05)	–0.02 (0.05)	0.02 (0.04)	0.03 (0.05)	0.03 (0.04)
Social services/Education	–0.03 (0.04)	0.04 (0.05)	0.03 (0.04)	0.01 (0.04)	0.05 (0.04)	0.03 (0.04)	0.04 (0.04)

LPM includes main effects of nationality, HE institution and interaction terms with period; robust standard errors in parentheses; \* $p < 0.05$ , \*\* $p < 0.01$ , \*\*\* $p < 0.001$

STEM fields over time. However, these changes are not consistently significant at conventional criteria.<sup>2</sup>

Tab. 6 shows field of study differences in terms of average marginal effects in access to different service class segments. Since graduates from professional programs almost exclusively end up in particular segments (medicine/pharmacy and teaching in social and cultural services, law in administrative/management) when being employed in the service class, estimates for the professions are not shown in this table.

As with the vocational training market, West Germany's occupational linkages with fields of study are evident in the graduate labour market, too. Students from different fields

of study enter distinct occupational segments after graduation. While graduates from humanities/social sciences/arts and social services/education have strong advantages in attaining positions in the social and cultural services compared to other fields, graduates from STEM fields have a higher probability of being employed in the technical expert segment. When gaining access to the service class business and management graduates are more likely to find employment in administrative and managerial occupations than all other groups. These patterns are clearly less pronounced among women than among men at the beginning of the observation period.

Over time, some shifts in these patterns can be identified. For men, all field groups became increasingly disadvantaged (engineering/agronomics, humanities/social sciences/arts, social services/education) or less advantaged

<sup>2</sup> The results do not change when including employment sector as additional covariate into the models (results upon request).

**Tab. 5** Graduates' field of study and access to service class positions, EGP I and II (linear probability model). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men (N = 29,450)</i>	1980	1985–1987	1989–1993	1995/1996	2000	2004–2005	2006–2008
Ref. Science/Mathematics							
Medicine/Pharmacy	0.05* (0.02)	−0.07* (0.03)	−0.06 (0.03)	−0.05 (0.04)	−0.04 (0.04)	−0.05 (0.03)	−0.03 (0.03)
Teaching	0.05 (0.03)	0.00 (0.03)	0.03 (0.03)	0.03 (0.03)	0.02 (0.03)	0.02 (0.03)	0.02 (0.03)
Law	−0.03 (0.03)	0.01 (0.04)	0.03 (0.04)	0.06 (0.04)	−0.03 (0.05)	0.02 (0.04)	0.02 (0.04)
Engineering/Agronomics	−0.01 (0.03)	−0.02 (0.03)	0.03 (0.03)	−0.02 (0.03)	−0.04 (0.03)	−0.03 (0.03)	0.01 (0.03)
Business/Management	−0.29*** (0.04)	0.07 (0.04)	0.07 (0.04)	0.12** (0.04)	0.13** (0.04)	0.14*** (0.04)	0.14*** (0.04)
Humanities/Social sciences/Arts	−0.06 (0.04)	0.01 (0.04)	0.04 (0.04)	0.08 (0.04)	−0.07 (0.05)	−0.02 (0.04)	−0.02 (0.04)
Social services/Education	−0.03 (0.04)	0.00 (0.04)	−0.01 (0.04)	0.04 (0.04)	−0.15* (0.07)	−0.02 (0.05)	−0.02 (0.04)
<i>Women (N = 17,641)</i>	1980	1985–1987	1989–1991	1995/1996	2000	2004–2005	2006–2008
Ref. Science/Mathematics							
Medicine/Pharmacy	0.09 (0.07)	−0.07 (0.08)	−0.02 (0.08)	0.01 (0.08)	0.01 (0.08)	−0.07 (0.08)	−0.02 (0.08)
Teaching	0.11 (0.08)	−0.03 (0.08)	0.03 (0.08)	0.08 (0.08)	0.03 (0.08)	−0.04 (0.08)	−0.01 (0.08)
Law	0.06 (0.10)	−0.10 (0.11)	−0.04 (0.11)	0.03 (0.11)	0.03 (0.11)	−0.13 (0.11)	−0.04 (0.11)
Engineering/Agronomics	−0.17 (0.14)	0.05 (0.15)	0.15 (0.15)	0.12 (0.15)	0.16 (0.15)	0.12 (0.14)	0.19 (0.14)
Business/Management	−0.34** (0.11)	0.05 (0.12)	0.11 (0.11)	0.28* (0.11)	0.14 (0.12)	0.16 (0.11)	0.14 (0.11)
Humanities/Social sciences/Arts	0.04 (0.08)	−0.07 (0.08)	−0.08 (0.08)	0.02 (0.08)	−0.10 (0.09)	−0.17* (0.08)	−0.11 (0.08)
Social services/Education	0.08 (0.07)	−0.06 (0.08)	−0.11 (0.08)	−0.05 (0.08)	−0.09 (0.09)	−0.15 (0.08)	−0.14 (0.08)

LPM includes main effects of nationality, HE institution and interaction terms with period; robust standard errors in parentheses; \* $p < 0.05$ , \*\* $p < 0.01$ , \*\*\* $p < 0.001$

(business/management) in access to the administrative and managerial segments compared to science and mathematics. Hence, for men, the segment of administrative and managerial positions has been increasingly dominated by science/mathematics and business/management graduates over time. In contrast, in access to technical expert positions, some fields (business/management, humanities/social sciences/arts and social services/education) reduced the gap towards science and mathematics or had a larger probability advantage (engineering) across periods. Hence, male graduates from science and mathematics were increasingly found in administrative and managerial positions rather than technical expert positions. The segment of social and cultural services continued to be dominated by graduates from humanities/social sciences/arts and social services/education.

For women, business and management graduates became somewhat more advantaged in attaining administrative and managerial positions over other field groups across time. While for technical expert positions the gap between humanities/social sciences/arts, social services/education and STEM fields increased, it was the opposite for positions in social and cultural services. Hence, patterns became increasingly similar to those of men across periods.

## 5 Discussion

The literature commonly argues that the field of study became a more important selection criterion for employers during educational expansion (Jackson et al. 2005; Hansen 2001; Van de Werfhorst 2002). When higher education is

**Tab. 6** Field of study and access to service class segments (average marginal effects). (German Microcensus, Scientific-Use-Files 1980–2008)

<i>Men (N = 29,450)</i>							
<i>EGP I/II admin./manag</i>	<i>1980</i>	<i>1985–1987</i>	<i>1989–1993</i>	<i>1995/1996</i>	<i>2000</i>	<i>2004–2005</i>	<i>2006–2008</i>
Ref. Science/Mathematics							
Engineering/Agronomics	–0.02 (0.03)	–0.15*** (0.02)	–0.15*** (0.02)	–0.18*** (0.02)	–0.37*** (0.03)	–0.38*** (0.03)	–0.36*** (0.02)
Business/Management	0.21*** (0.04)	0.23*** (0.03)	0.18*** (0.02)	0.14*** (0.02)	–0.01 (0.03)	–0.01 (0.03)	0.03 (0.02)
Humanities/Social sciences/Arts	–0.07* (0.03)	–0.13*** (0.03)	–0.16*** (0.02)	–0.23*** (0.02)	–0.39*** (0.04)	–0.37*** (0.03)	–0.36*** (0.03)
Social services/Education	–0.10*** (0.03)	–0.20*** (0.02)	–0.19*** (0.02)	–0.27*** (0.02)	–0.50*** (0.04)	–0.41*** (0.04)	–0.39*** (0.03)
<i>EGP I/II technical experts</i>							
Ref. Science/Mathematics							
Engineering/Agronomics	0.07 (0.04)	0.26*** (0.02)	0.21*** (0.02)	0.17*** (0.02)	0.35*** (0.03)	0.37*** (0.03)	0.41*** (0.02)
Business/Management	–0.36*** (0.04)	–0.31*** (0.03)	–0.35*** (0.02)	–0.29*** (0.02)	–0.14*** (0.03)	–0.12*** (0.03)	–0.12*** (0.02)
Humanities/Social sciences/Arts	–0.45*** (0.05)	–0.35*** (0.02)	–0.41*** (0.02)	–0.41*** (0.02)	–0.20*** (0.03)	–0.20*** (0.03)	–0.19*** (0.02)
Social services/Education	–0.54*** (0.04)	–0.44*** (0.02)	–0.46*** (0.02)	–0.44*** (0.02)	–0.26*** (0.03)	–0.26*** (0.03)	–0.24*** (0.02)
<i>EGP I/II social services</i>							
Ref. Science/Mathematics							
Engineering/Agronomics	–0.07* (0.03)	–0.14*** (0.02)	–0.14*** (0.02)	–0.05*** (0.01)	–0.02 (0.01)	–0.04** (0.01)	–0.05** (0.01)
Business/Management	–0.14*** (0.03)	–0.14*** (0.02)	–0.14*** (0.02)	–0.04*** (0.01)	–0.03** (0.01)	–0.02 (0.02)	–0.04** (0.02)
Humanities/Social sciences/Arts	0.42*** (0.05)	0.41*** (0.03)	0.41*** (0.03)	0.54*** (0.02)	0.64*** (0.03)	0.45*** (0.04)	0.48*** (0.03)
Social services/Education	0.59*** (0.05)	0.60*** (0.03)	0.60*** (0.03)	0.61*** (0.03)	0.72*** (0.03)	0.59*** (0.06)	0.62*** (0.04)
<i>Women (N = 17,641)</i>							
<i>EGP I/II admin./manag</i>	<i>1980</i>	<i>1985–1987</i>	<i>1989–1993</i>	<i>1995/1996</i>	<i>2000</i>	<i>2004–2005</i>	<i>2006–2008</i>
Ref. Science/Mathematics							
Engineering/Agronomics	–0.08 (0.05)	–0.08 (0.04)	–0.07* (0.03)	–0.07* (0.03)	–0.14** (0.05)	–0.14** (0.04)	–0.09* (0.04)
Business/Management	0.17 (0.09)	0.20** (0.05)	0.24*** (0.04)	0.30*** (0.03)	0.16** (0.05)	0.25*** (0.04)	0.24*** (0.04)
Humanities/Social sciences/Arts	–0.05 (0.06)	–0.08* (0.03)	–0.09*** (0.03)	–0.11*** (0.03)	–0.12** (0.05)	–0.13** (0.04)	–0.10** (0.03)
Social services/Education	–0.07 (0.05)	–0.13*** (0.03)	–0.14*** (0.03)	–0.16*** (0.03)	–0.22*** (0.05)	–0.24*** (0.04)	–0.23*** (0.03)
<i>EGP I/II technical experts</i>							
Ref. Science/Mathematics							
Engineering/Agronomics	0.34* (0.15)	0.23*** (0.05)	0.18*** (0.04)	0.06 (0.05)	0.31*** (0.06)	0.25*** (0.05)	0.24*** (0.04)
Business/Management	0.06 (0.08)	–0.12** (0.04)	–0.27*** (0.03)	–0.26*** (0.03)	–0.19*** (0.05)	–0.22*** (0.04)	–0.27*** (0.03)
Humanities/Social sciences/Arts	0.04 (0.06)	–0.15*** (0.03)	–0.28*** (0.03)	–0.38*** (0.03)	–0.30*** (0.04)	–0.30*** (0.04)	–0.31*** (0.03)
Social services/Education	–0.07 (0.05)	–0.21*** (0.03)	–0.33*** (0.03)	–0.36*** (0.03)	–0.31*** (0.04)	–0.33*** (0.04)	–0.36*** (0.03)

**Tab. 6** Field of study and access to service class segments (average marginal effects). (German Microcensus, Scientific-Use-Files 1980–2008) (Continued)

<i>EGP I/II social services</i>	1980	1985–1987	1989–1991	1995/1996	2000	2004–2005	2006–2008
Ref. Science/Mathematics							
Engineering/Agronomics	–0.35* (0.16)	–0.26*** (0.06)	–0.14*** (0.03)	–0.04 (0.03)	–0.17*** (0.04)	–0.17*** (0.04)	–0.13*** (0.03)
Business/Management	–0.57*** (0.10)	–0.39*** (0.05)	–0.20*** (0.03)	–0.10*** (0.02)	–0.20*** (0.03)	–0.15*** (0.04)	–0.16*** (0.03)
Humanities/Social sciences/Arts	0.06 (0.10)	0.20*** (0.04)	0.34*** (0.03)	0.55*** (0.03)	0.37*** (0.05)	0.31*** (0.04)	0.35*** (0.03)
Social services/Education	0.22* (0.09)	0.36*** (0.04)	0.42*** (0.03)	0.55*** (0.03)	0.51*** (0.05)	0.49*** (0.04)	0.52*** (0.03)

Multinomial logistic regressions include main effects of nationality, HE institution and interaction terms with period; average marginal effects shown; robust standard errors in parentheses; \* $p < 0.05$ , \*\* $p < 0.01$ , \*\*\* $p < 0.001$

more widespread in the population, employers may have increasing difficulties to regard a degree as reliable signal for future productivity and therefore use other signals such as the field of study. From a supply-side perspective, it was argued that due to their growing selectivity in terms of unable or less motivated students the less academically challenging fields like humanities/social sciences/arts and social services/education may increasingly be regarded as negative signals by employers. From a demand-side perspective, I additionally proposed that compositional changes in the high-skilled labour market could favour graduates from STEM fields rather than from humanities/social sciences/arts and social services/education in terms of occupational attainment. This suggests an increasing gap in occupational attainment between humanities and social services subjects and STEM fields.

Contrary to these expectations, I further argued that this scenario may be unrealistic in the West German setting because of its occupationally segmented labour market, the moderate higher education expansion and the close match between the growing number of graduates and the upgrading of the occupational structure. Therefore, the alternative hypothesis assumes that there are no changes in the association between graduates' field of study and occupational attainment over time.

The results show that field of study differences in unemployment risk are small and do not diverge between fields over time. Tertiary graduates in West Germany continue to have a low risk of unemployment across time (Klein 2015) and this appears to be evident for graduates from all fields. In terms of access to the service class, graduates from business/management have a significantly lower probability of entering professional or managerial occupations. Over time, they were somewhat able to reduce their initial disadvantages in access to the service class. Apart from this, graduates from different fields of study do not significantly differ in access to service class positions. Moreover, graduates from humanities/social sciences/arts and so-

cial services/education did not become more disadvantaged in entering the service class compared to graduates from STEM fields over time. Despite of compositional changes in the service class (relative increase of administrative and managerial positions, relative decrease of social and cultural services) they have not been increasingly pushed into inappropriate positions below the service class.

Overall, field of study differences in occupational attainment did not increase over time in West Germany supporting the alternative hypothesis 1b. Higher education in Germany seems to remain a good investment in terms of occupational attainment irrespective of the chosen field of study. Given that the association between graduates' social origin and field of study remained similarly constant over time (Reimer and Pollak 2010), social inequalities in occupational attainment tend to be far from increasingly transmitted via the field of study over the course of educational expansion in West Germany.

Differences between fields of study in their signalling capacity of selectivity seem to be inappropriate for explaining fields' varying labour market returns over time in West Germany. This is because signalling explanations rely on the unrealistic assumption of a unidimensional labour and job queue, in which all graduates compete for all available job vacancies. Given that fields of study have strong linkages to particular occupational segments in the West German labour market and signalling theory does not take into account labour market structures, it is unable to account for field of study differences in the labour market.

Though, the field of study may increasingly matter in countries with a massive higher education expansion or in firm internal labour markets where initial occupational placement is less determined by individuals' educational level. In line with this reasoning, field of study differences in access to the service class have been found to be stronger in the UK than in Germany (Kim and Kim 2003). Future research should therefore concentrate on a country

with a more pronounced HE expansion and loose linkages between higher education and the labour market.

While in occupationally segmented labour markets the field of study does not appear to play a more dominant role in labour market allocation over time, other within-field differentiations indicating occupation-specific skills may have become increasingly important when graduate numbers are on the rise. For instance, Weiss et al. (2014) have shown that field-specific work experience before graduating from higher education smoothens graduates' labour market integration in Germany. It would be worthwhile to investigate whether such qualitative differences within fields matter more in terms of labour market returns than in former times.

This article concentrated on comparing field of study differences in occupational attainment among labour market entrants over time. However, while the initial placement in the labour market is decisive, graduates from different fields of study might also have, on average, different career trajectories and, further, field-specific occupational trajectories might evolve differently across periods. Future research should therefore be more concerned with both modelling career trajectories of graduates from different fields of study and how these typical career paths change under differing macrostructural conditions.

The paper is limited in considering only two labour market outcomes, risk of unemployment and access to the service class. If positions within the service class became in-

creasingly heterogeneous in terms of wages over time and this growing diversity is, in turn, related to the field of study, the paper does not capture increasing field of study differences in economic returns. However, the growing wage inequalities over time have been found to be predominantly attributed to a growing gap between occupational classes, and particularly between the service class and all other classes (Giesecke and Verwiebe 2008, 2009). This suggests that the service class continues to be a strong indicator of economic returns in the labour market. Nevertheless, future studies may consider various other outcomes such as wages or being exposed to fixed-term contracts in order to provide a more coherent picture on the relationship between graduates' field of study and labour market outcomes over time.

**Acknowledgements** I would like to thank Walter Müller, Steffen Schindler, Martin Neugebauer, Martin Abraham and three anonymous reviewers for helpful comments on an earlier version of this article.

**Funding** This research received funding from the German Federal Ministry of Education and Research, grant 01JG0926.

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## Appendix

**Tab. 7** Occupational classification in service class segments

I/II administrative/management	I/II experts	I/II social services
Agricultural engineer	Mechanical engineer	Physician
Horticultural engineer	Electrical engineer	Dentist
Forester, Gamekeeper	Building engineer	Veterinary
Wholesaler, export merchant	Engineer for cartography	Pharmacist
Sales director and manager in commerce	Mining engineer	Professor and related positions
Purchasing manager	Other production engineers	Teacher for upper secondary school
Banking expert	Industrial engineer	Humanities scholar, NES
Advertising expert	Miscellaneous engineers	Social scientist, NES
Agent middleman, real estate agent	Architect	Education researcher, NES
Entrepreneur, chief executive officer, NES	Chemist, chemical engineer	Psychologist
Division manager, assistant manager, NES	Physicist, physical engineer, mathematician	Clergy
Auditor, tax accountant and related positions	Surveying technician	Journalist
Assistant in economic and tax law	Technician for science of management	Interpreter, translator
Marketing and sales experts	Biologically and technically trained assistant	Librarian, archivist, museum guide
Analyst, controller and related positions	Physically and technically trained assistant	Musician
Executive consultant and related positions	Draftsman	Dramatic artist, singer
Delegates, minister, electoral officials	Architectural draftsman, mappers and related pos	Graphic artist
Executive staff in public administration	Captain (coasting and ocean shipping)	Art-related occupations
Executive staff in associations	Technical ship officer, ship mechanist	Artiste, professional
Head in associations, official	Scientist, NES	Natural health professional
Upper-level civil servants	Economist, NES	Kneader, medical bath attendant, physiotherapist
Upper-middle-level civil servants	Natural scientist, NES	Pharmacology technician
Financial expert, accountant	Statistician, market researcher	Therapeutic occupations, NES
Data processing expert, computer scientist, NES	Advisory and scheduling expert	Social worker, social pedagogue
Software developer		Remedial teacher
Computer personnel		Teacher, NES
Computer marketing expert		Teacher for lower secondary school
Datacenter service		Teacher for vocational school
Other data processing experts		Teacher for musical subjects
Judge, prosecutor		Sports teacher
Law (enforcement) officer		
Legal representative, lawyer		
Employment adviser, career consultant		

German classification KIdB (*Klassifizierung der Berufe*) version 1975; since 1993 Microcensus KIdB version 1992 (3-digits); NES not elsewhere specified

**Tab. 8** Field of study classification in major field groups

Field of study groups	Subjects
Teaching	Teacher at <i>Grundschule/Hauptschule</i> , teacher at <i>Realschule</i> , teacher at <i>Gymnasium</i> , teacher at <i>Sonderschule</i> (special schools), teacher at <i>Berufsschule</i> (vocational school), sports teacher
Law	Law
Medicine/Pharmacology	Human medicine, dentistry, veterinary medicine, pharmacology
Science/Technology/Mathematics	Mathematics, statistics, computer sciences, physics, astronomy, chemistry, food chemistry, biology, biological chemistry, biotechnology
Engineering/Agronomics	Engineering sciences, mining, engine construction, electrical, engineering, traffic engineering, nautics, architecture, spatial planning, construction engineering, surveying and mapping, chemical engineering, environment protection, environmental technology, waste management, supply engineering, nuclear engineering, agronomics, farming, plant production, forestry, forest and wood management
Business/Management/ Economics	Science of public administration, economics, business economics, tourism, marketing and promotion, banking, finance and insurances, management, accounting and taxation, engineering economics, security management
Humanities/Social Sciences/ Arts	Christian theology, other religious studies, philosophy, history, librarianship, media studies, journalism, linguistics, cultural sciences, classical philology, German language and literature studies, anglistics, American studies, romance studies, slavic studies, extra-European linguistics, political science, social sciences, sociology, psychology, geography, art history, aesthetics, visual arts, performing arts, film and television, music, musicology, design, interior architecture, audiovisual techniques and media
Social services/Education	Social welfare services, social work, social pedagogy, therapeutic pedagogy, nursing science, nutrition science, health management, educational science

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