Table 1
Reasons for bank debt applications

Panel A – Reasons for overdrafts applications (N=10673)	%
Working capital/Cash flow	81.30
As a safety net	39.24
To cover a short-term funding gap	26.02
To fund growth of the business in the UK	15.42
Purchase of equipment/machinery	11.72
To fund growth of the business overseas	1.99
Panel B – Reasons for loans applications (N=5864)	%
To fund growth of the business in the UK	28.89
Purchase of premises	26.67
Purchase of equipment/machinery	25.70
To develop new products/services	13.73
To replace other funding	12.33
Purchase of motor vehicles	12.02
Working capital/Cash flow	6.38
To take over another business	2.81
To fund growth of the business overseas	2.46

Notes: Percentages are calculated out of SMEs which applied for overdrafts/loans during the period 2010-2017. Figures do not add up to 100% because respondents can choose more than one answer.

 $\label{eq:Table 2}$ Business overdrafts and term loans applications and rejections by sub-periods

Application	# of	# of	Loans/	% changes	% changes	Overdrafts	Loans
dates	Overdrafts	loans	overdrafts	overdrafts	loans	Rejections	Rejections
						(%)	(%)
2010	608	350	58%	-	-	18.91	24.29
2011	2227	1103	50%	266%	215%	19.04	27.92
2012	1888	923	49%	-15%	-16%	22.67	29.79
2013	1565	781	50%	-17%	-15%	20.77	29.58
2014	1348	745	55%	-14%	-5%	12.09	20.54
2015	1087	611	56%	-19%	-18%	9.02	16.20
2016	713	367	51%	-34%	-40%	9.82	18.80
2017	523	247	47%	-27%	-33%	8.03	15.38

Notes: Applications in 2010 and 2017 are underestimated due to the way the survey question is formulated (see details in Section 4). Reported data include SMEs which applied for overdrafts/loans over 2010-2017.

Table 3

List of variables and their definitions

Variable	Description
Dependent variable	
Bank debt rejection	A dummy variable which equals 1 if the bank debt application was rejected (refused outright
	or received less credit than it requested) and 0 otherwise.
Independent variables	
Application date	Dummy variables indicating the exact year when the firm applied for the bank debt: 'applications in 2010', 'applications in 2011', 'applications in 2012', 'applications in 2013', 'applications in 2014', 'applications in 2015', 'applications in 2016' and 'applications in 2017'.
Credit balance	Dummy variables indicating the amount that the firm usually holds in current and deposit accounts: 'no credit balance', '<£5,000', '£5,000-9,999', '£10,000-49,999', '£50,000-99,999', '£100,000-499,999', '£500,000-999,999' and '>£1m'.
Owner/Manager charac	
Gender	Dummy variables indicating the gender of the owner/manager: 'male', 'female' and 'both (joint partners)'.
Legal status	Dummy variables indicating the legal status of the firm: 'sole proprietorship', 'partnership', 'limited liability partnership' and 'limited liability company'.
Owner Age	Dummy variables indicating the age of the owner/manager: '18-30 years', '31-50 years' and '>50 years'.
Financial knowledge	A dummy variable which equals 1 if the person in charge of financial management within the firm has a finance qualification or has undertaken some financial trainings and 0 otherwise.
Bank relationship and/o	or products
Multiple suppliers	A dummy variable which equals 1 if the firm approached more than one bank/financial institution when the firm did its most business and 0 otherwise.
Main bank	A dummy variable which equals 1 if the firm applied to its main bank and 0 otherwise.
Use of credit card	A dummy variable which equals 1 if the firm uses credit card currently and 0 otherwise
Firm characteristics	
Number of employees	Dummy variables indicating the number of people working in the firm: '0-9', '10-49' and '50-249'.
Annual turnover	Dummy variables indicating the annual turnover of the firm: '<£50,000', '£50,000-99,999', '£100,000-499,999', '£500,000-999,999', '£1m-4.9m' and '>£5m'.
Business age	Dummy variables indicating the number of years since the firm was established: '<2 years', '2-5 years', '6-9 years', '10-15 years' and '>15 years'.
Standard region	Dummy variables indicating the location of the firm in the UK: 'London', 'East Anglia', 'East Midlands', 'North West', 'North/ North East', 'Northern Ireland', 'Scotland', 'South East', 'South West', 'Wales', 'West Midlands' and 'Yorkshire/ Humberside'.
Industry sector	Dummy variables indicating the principal activity of the firm: 'construction', 'agriculture, hunting and forestry fishing', 'health and social work', 'hotels and restaurants', 'manufacturing', 'real estate, renting and business activities', 'transport, storage and
Profitability	communication', 'wholesale/retail' and 'other community, social and personal service' Dummy variables indicating whether the firm made a net profit or loss: 'loss', 'broken even'
	and 'profit'.
Business plan	A dummy variable which equals 1 if the firm has a formal written business plan and 0 otherwise.
Export	A dummy variable which equals 1 if the firm sells goods or services abroad and 0 otherwise.
Import	A dummy variable which equals 1 if the firm buys goods or services from abroad and 0 otherwise.
Management account	A dummy variable which equals 1 if the firm produces regular monthly or quarterly management accounts and 0 otherwise.
Improvement	A dummy variable which equals 1 if the firm has significantly improved an aspect of the firm in the past 3 years and 0 otherwise.

Innovation	A dummy variable which equals 1 if the firm has developed a new product or service in the
	past 3 years and 0 otherwise.
D&B risk rating	Dummy variables indicating the external credit risk rating from Dun & Bradstreet (D&B) of
	the firm: 'minimal', 'low', 'average', 'above average' and 'undetermined'a.
Application process-	related
Seeking advice	A dummy variable which equals 1 if the firm sought external advice before applying for the
	bank debt and 0 otherwise.
Business account	A dummy variable which equals 1 if the main current account used for the business is a
	business account and 0 otherwise.
Amount applied	Dummy variables indicating the amount of bank debt that the firm initially applied for:
	'<£5,000', '£5,000-9,999', '£10,000-49,999', '£50,000-99,999', '£100,000-499,999',
	'£500,000-999,999' and '>£1m'.

^a: 'Undetermined' means the information available to D&B is not enough to allow D&B to assign a risk rating level to the firm.

Table 4

Descriptive statistics and difference in means: business overdrafts and loans

			Bı	usiness overd	Irafts				Term loan	S	
Variables		All (N=10673) Mean	Rejected (N=1738) Mean (a)	Approved (N=8935) Mean (b)	Difference (a-b)	t-statistic	All (N=5864) Mean	Rejected (N=1386) Mean (a)	Approved (N=4478) Mean (b)	Difference (a-b)	t-statistic
Application date ^b	Applications in 2010	0.0611	0.0691	0.0594	0.0096	1.4293	0.0683	0.0676	0.0685	-0.0009	-0.1134
TF	Applications in 2011	0.2236	0.2547	0.2174	0.0373	3.2126***	0.2151	0.2448	0.2055	0.0394	2.8603***
	Applications in 2012	0.1896	0.2571	0.1760	0.0810	7.0455***	0.1800	0.2186	0.1675	0.0511	3.8982***
	Applications in 2013	0.1571	0.1952	0.1495	0.0457	4.3615***	0.1523	0.1836	0.1422	0.0415	3.3771***
	Applications in 2014	0.1353	0.0979	0.1429	-0.0450	-5.4606***	0.1453	0.1216	0.1530	-0.0314	-2.8836***
	Applications in 2015	0.1091	0.0589	0.1192	-0.0604	-8.9076***	0.1192	0.0787	0.1323	-0.0536	-5.7385***
	Applications in 2016	0.0716	0.0420	0.0775	-0.0355	-6.1932***	0.0716	0.0548	0.0770	-0.0222	-2.8717***
	Applications in 2017	0.0525	0.0252	0.0580	-0.0328	-7.0894***	0.0482	0.0302	0.0540	-0.0238	-3.9406***
Credit balance ^c	No credit balance	0.0663	0.0563	0.0684	-0.0121	-1.8170*	0.0672	0.0568	0.0707	-0.0139	-1.7326*
	<£5,000	0.3404	0.5291	0.3009	0.2283	16.2852***	0.3147	0.4568	0.2670	0.1898	11.6341***
	£5,000-9,999	0.1438	0.1601	0.1404	0.0197	1.9008*	0.1435	0.1712	0.1342	0.0370	2.9868***
	£10,000-49,999	0.2151	0.1654	0.2255	-0.0600	-5.5501***	0.2094	0.1822	0.2185	-0.0363	-2.7448***
	£50,000-99,999	0.0815	0.0355	0.0911	-0.0556	-9.4569***	0.0846	0.0551	0.0946	-0.0395	-4.7710***
	£100,000-499,999	0.0899	0.0415	0.1001	-0.0585	-9.3366***	0.1043	0.0542	0.1211	-0.0668	-7.7792***
	£500,000-999,999	0.0367	0.0067	0.0430	-0.0363	-11.3570***	0.0420	0.0144	0.0513	-0.0369	-7.2446***
	>£1m	0.0263	0.0054	0.0307	-0.0253	-9.1043	0.0343	0.0093	0.0427	-0.0334	-7.5683***
Owner/Manager characteristics	Gender						İ				
0	Male	0.7941	0.8061	0.7917	0.0144	1.3810	0.7911	0.7944	0.7901	0.0043	0.3444
	Female	0.1714	0.1755	0.1706	0.0049	0.4945	0.1772	0.1833	0.1753	0.0080	0.6719
	Both (joint partners)	0.0346	0.0184	0.0377	-0.0193	-5.0755***	0.0317	0.0224	0.0346	-0.0122	-2.5398**
	Owner Age ^a										
	18-30 years	0.0245	0.0558	0.0184	0.0374	6.5086***	0.0272	0.0501	0.0201	0.0300	4.7695***
	31-50 years	0.4335	0.5112	0.4183	0.0928	7.0252***	0.4598	0.5596	0.4285	0.1311	8.4988***
	>50 years	0.5420	0.4331	0.5633	-0.1302	-9.9176***	0.5130	0.3903	0.5514	-0.1612	-10.5700***
	Financial knowledge ^a	0.4286	0.3600	0.4420	-0.0820	-6.4244***	0.4462	0.3808	0.4666	-0.0858	-5.6584***
	Legal status						İ				
	Sole proprietorship	0.1833	0.3015	0.1603	0.1412	12.0970***	0.1806	0.2973	0.1445	0.1528	11.4370***
	Partnership	0.1394	0.0938	0.1483	-0.0545	-6.8636***	0.1497	0.0974	0.1659	-0.0685	-7.0527***
	Limited Liability Partnership	0.0502	0.0357	0.0530	-0.0174	-3.4460***	0.0554	0.0469	0.0581	-0.0112	-1.6738*
	Limited Liability Company	0.6271	0.5690	0.6384	-0.0693	-5.3656***	0.6143	0.5584	0.6315	-0.0731	-4.8193***
Bank relationship and/or	Multiple suppliers	0.0409	0.0397	0.0412	-0.0015	-0.2893	0.0583	0.0584	0.0583	0.0002	0.0217
products	Main bank	0.9813	0.9724	0.9830	-0.0106	-2.5476**	0.8852	0.8723	0.8892	-0.0169	-1.6740*

	Use of credit carda	0.4482	0.3700	0.4634	-0.0934	-7.3401***	0.4192	0.3636	0.4364	-0.0727	-4.8804***
Firm characteristics	Number of employees										
	0-9	0.4442	0.6318	0.4077	0.2240	17.6590***	0.4205	0.6140	0.2826	0.2533	16.9790***
	10-49	0.3909	0.2975	0.4091	-0.1116	-9.1928***	0.3883	0.3131	0.4116	-0.0984	-6.8027***
	50-249	0.1649	0.0708	0.1832	-0.1124	-15.2160***	0.1912	0.0729	0.2278	-0.1549	-16.5070***
	Annual turnover ^b										
	<£50,000	0.1181	0.2529	0.0917	0.1612	14.4610***	0.1198	0.2405	0.0819	0.1586	12.6350***
	£50,000-99,999	0.1054	0.1428	0.0981	0.0447	4.8582***	0.0964	0.1260	0.0871	0.0388	3.8214***
	£100,000-499,999	0.2379	0.2680	0.2320	0.0360	3.0400***	0.2316	0.2863	0.2144	0.0719	5.1293***
	£500,000-999,999	0.1422	0.1307	0.1445	-0.0138	-1.5160***	0.1353	0.1321	0.1363	-0.0043	-0.3977
	£1m-4.9m	0.2892	0.1585	0.3148	-0.1563	-15.1570***	0.2995	0.1740	0.3389	-0.1649	-12.8910***
	>£5m	0.1071	0.0472	0.1189	-0.0717	-11.3830***	0.1174	0.0412	0.1414	-0.1002	-13.0030***
	Business age										
	<2 years	0.0638	0.1893	0.0394	0.1499	15.5790***	0.0769	0.1746	0.0467	0.1279	11.9820***
	2-5 years	0.1039	0.2186	0.0816	0.1371	13.2660***	0.1129	0.2092	0.0831	0.1262	10.7990***
	6-9 years	0.1147	0.1381	0.1101	0.0280	3.1361***	0.1240	0.1551	0.1143	0.0408	3.7667***
	10-15 years	0.1651	0.1329	0.1713	-0.0384	-4.2385***	0.1572	0.1436	0.1615	-0.0179	-1.6387
	>15 years	0.5525	0.3211	0.5975	-0.2765	-22.3950***	0.5290	0.3175	0.5945	-0.2770	-13.1020***
	Profitability ^a										
	Loss	0.1342	0.2381	0.1143	0.1238	11.1760***	0.1296	0.2248	0.1004	0.1243	10.0010***
	Broken even	0.0675	0.1074	0.0599	0.0476	5.8958***	0.0684	0.0895	0.0620	0.0275	3.1544***
	Profit	0.7983	0.6545	0.8258	-0.1714	-13.7660***	0.8019	0.6858	0.8376	-0.1518	-10.8220***
	Business plan	0.5378	0.5460	0.5362	0.0098	0.7523	0.5781	0.5714	0.5802	-0.0087	-0.5748
	Export	0.1657	0.1387	0.1710	-0.0323	-3.5163***	0.1620	0.1335	0.1708	-0.0374	-3.4813***
	Import	0.1906	0.1542	0.1976	-0.0434	-4.5095***	0.1949	0.1501	0.2088	-0.0587	-5.1707***
	Management account	0.7070	0.6484	0.7184	-0.0700	-5.6400***	0.7091	0.6364	0.7316	-0.0952	-6.5556***
	Improvement	0.5538	0.5587	0.5529	0.0058	0.4458	0.5694	0.5628	0.5715	-0.0087	-0.5701
	Innovation	0.2570	0.2842	0.2517	0.0325	2.7669***	0.2739	0.2908	0.2686	0.0221	1.5930
	D&B risk rating										
	Minimal	0.1558	0.0558	0.1753	-0.1195	-17.5144***	0.1574	0.0671	0.1854	-0.1183	-13.3107***
	Low	0.2732	0.1743	0.2924	-0.1181	-11.4699***	0.2766	0.1696	0.3097	-0.1402	-11.4682***
	Average	0.2636	0.2342	0.2693	-0.0351	-3.1361***	0.2602	0.2799	0.2541	0.0258	1.8831*
	Above Average	0.2340	0.4212	0.1976	0.2235	17.7770***	0.2282	0.3759	0.1824	0.1935	13.5878***
	Undetermined	0.0734	0.1145	0.0654	0.0491	6.0851***	0.0776	0.1075	0.0683	0.0392	4.2866***
Application process -related	Seeking advice ^a	0.1180	0.1697	0.1079	0.0617	6.3881***	0.2461	0.2319	0.2505	-0.0186	-1.4041
	Business account ^a	0.9761	0.9476	0.9816	-0.0340	-6.1466***	0.9710	0.9465	0.9785	-0.0321	-4.9856***
	Amount applied ^c										
	<£5,000	0.1505	0.3202	0.1150	0.2052	16.8940***	0.0630	0.1164	0.0450	0.0714	7.4044***
	£5,000-9,999	0.1057	0.1493	0.0965	0.0527	5.5710***	0.0893	0.1489	0.0692	0.0796	7.3425***
	£10,000-49,999	0.3519	0.3091	0.3609	-0.0518	-4.0749***	0.2830	0.3682	0.2543	0.1138	7.4288***
	£50,000-99,999	0.1293	0.0888	0.1377	-0.0489	-6.0491***	0.1212	0.0879	0.1324	-0.0445	-4.5841***

£100,000-499,999	0.1940	0.1073	0.2122	-0.1048	-11.6690***	0.2744	0.1900	0.3028	-0.1128	-8.4480***
£500,000-999,999	0.0397	0.0191	0.0440	-0.0249	-6.0343***	0.0715	0.0412	0.0818	-0.0406	-5.6677***
>£1m	0.0289	0.0062	0.0337	-0.0275	-9.7371***	0.0976	0.0475	0.1145	-0.0670	-8.4512***

Notes: The sample size is not identical due to the existence of missing values in some specific variables.

a: The sample includes less than 5% missing values. b: The sample includes 5%-10% missing values. c: The sample includes more than 10% missing values. *, **, *** indicate that the differences in means between rejected firms and approved firms are significant at 10%, 5% and 1% level, respectively.

Table 5
Bank debt rejection: logistic model

		Mod	el (1)	Mod	lel (2)
		Overdrafts	Loans	Overdrafts	Loans
Application date	Applications in 2011				
	Applications in 2012	0.0283** (0.0110)		0.0157* (0.0090)	
	Applications in 2013	(0.0110)		0.0164* (0.0097)	
	Applications in 2014	-0.0724*** (0.0104)	-0.0783*** (0.0156)	-0.0343*** (0.0096)	-0.0388*** (0.0149)
	Applications in 2015	-0.1007*** (0.0103)	-0.1149*** (0.0160)	-0.0576*** (0.0109)	-0.0625*** (0.0164)
	Applications in 2016	-0.0917*** (0.0124)	-0.0991*** (0.0200)	-0.0399*** (0.0119)	-0.0499** (0.0196)
	Applications in 2017	-0.1172*** (0.0123)	-0.1253*** (0.0222)	-0.0592*** (0.0129)	-0.0576** (0.0232)
Credit balance	£5,000-9,999		(-0.0221** (0.0086)	-0.0292* (0.0156)
	£10,000-49,999			-0.0340*** (0.0090)	-0.0506*** (0.0144)
	£50,000-99,999			-0.0514*** (0.0124)	-0.0432** (0.0217)
	£100,000-499,999			-0.0476*** (0.0125)	-0.0489** (0.0220)
	£500,000-999,999			-0.0782*** (0.0169)	-0.0707** (0.0313)
	>£1m			-0.0577** (0.0225)	-0.0931*** (0.0339)
Owner/Manager	Gender			(111)	(,
characteristics	Female			-0.0222*** (0.0074)	-0.0329** (0.0129)
	Both (joint partners)			-0.0462*** (0.0154)	
	Legal status				
	Partnership			-0.0217** (0.0096)	-0.0614*** (0.0151)
	Owner age				
	31-50 years				0.0397***
Bank relationship	Main bank			-0.0582**	(0.0128)
and/or products Firm characteristics	Number of employees			(0.0278)	
r irm characteristics	10-49				-0.0307** (0.0143)
	50-249			-0.0301***	-0.0808***
	Annual turnover £50,000-99,999			(0.0103) -0.0177*	(0.0210)
	£1m-4.9m			(0.0102) -0.0257***	-0.0616***
	>£5m			(0.0097)	(0.0184) -0.1093***
	Business age				(0.0271)

		1			
	2-5 years			-0.0654***	
				(0.0226)	
	6-9 years			-0.1519***	-0.0845***
				(0.0250)	(0.0239)
	10-15 years			-0.1804***	-0.1319***
	•			(0.0265)	(0.0240)
	>15 years			-0.1939***	-0.1642***
	- J			(0.0269)	(0.0234)
	Profitability			(***=**)	(****=**)
	Broken even				-0.0778***
	Broken even				(0.0285)
	Profit			-0.0521***	-0.1073***
	Hont			(0.0104)	(0.0210)
	D:				(0.0210)
	Business plan			0.0117*	
	T			(0.0063)	0.0420***
	Innovation			0.0230***	0.0428***
				(0.0081)	(0.0142)
	D & B risk rating				
	Low			0.0400***	
				(0.0112)	
	Average			0.0374***	0.0638***
				(0.0107)	(0.0166)
	Above Average			0.0845***	0.0923***
	_			(0.0144)	(0.0185)
	Undetermined			0.0850***	0.0778***
				(0.0181)	(0.0257)
Application process-	Seeking advice			0.0775***	,
related	8			(0.0146)	
	Business account			-0.0327*	
				(0.0202)	
	Amount applied			(0.0202)	
	£5,000-9,999			-0.0317**	-0.0481*
	23,000-7,777			(0.0145)	(0.0288)
	£10,000-49,999			-0.0618***	-0.0542**
	£10,000-49,999				
	C50 000 00 000			(0.0143) -0.0580***	(0.0256)
	£50,000-99,999				-0.0996***
	2100 000 100 000			(0.0176)	(0.0288)
	£100,000-499,999			-0.0627***	-0.0773***
				(0.0179)	(0.0277)
	£500,000-999,999			-0.0743***	-0.0715**
				(0.0244)	(0.0356)
	>£1m			-0.1257***	-0.0740**
				(0.0262)	(0.0351)
Standard region		No	No	Yes	Yes
Industry sector		No	No	Yes	Yes
No. of observations		10673	5864	10673	5864
Wald test statistics a		36.81***	19.20***	23.65***	20.70***
Wald test statistics (20	15=2016) b	0.42	0.46	2.60	0.34
Wald test statistics (20		0.06	0.01	0.31	0.09
McFadden's pseudo R		0.0225	0.0132	0.1685	0.1585
		<u> </u>			

Notes: The table only reports the estimated marginal effects of significant coefficients after variable selection. Pooled standard errors are in parentheses. The dependent variable is whether an overdraft or a loan application is rejected or not. Model 1 only includes the variable application dates. Model 2 adds other explanatory variables as listed in Table 3. We use a multiple imputation to treat missing values.

^a: The null hypothesis of the Wald test is that all coefficients, excluding the constant term, are equal to zero simultaneously. ^b: The null hypothesis of the Wald test is that the coefficient of 'applications in 2015' equals the coefficient of 'applications in 2016'. ^C: The null hypothesis of the Wald test is that the coefficients of 'applications in 2015', 'applications in 2016' and 'applications in 2017' are same. *, **, *** indicate significance at 10%, 5% and 1% level, respectively.

Table 6

Bank debt rejection of firms with international trade: logistic model

nel A Export and import Sl	MEs				
	Ove	rdrafts	Loans		
Application date	Export	Import	Export	Import	
2011					
2012					
2013					
2014	-0.0316**	-0.0487***			
	(0.0149)	(0.0160)			
2015	-0.0361**	-0.0589***		-0.0656**	
	(0.0165)	(0.0175)		(0.0283)	
2016		-0.0489**		-0.0724**	
		(0.0199)		(0.0333)	
2017		-0.0611***			
		(0.0205)			
Control variables	Yes	Yes	Yes	Yes	
No. of obs	1769	2034	950	1143	
Wald test statistics	8.47***	8.78***	7.41***	8.24***	
McFadden's pseudo R ²	0.1443	0.1657	0.1668	0.1738	

D 1 D E		CATE		:41 1-:	. 1. . 1. . £ 1	CTT 4 1 -
Panel B Exp	oort and im	DOLL VIES	in indlistrie	s with a nic	on snare of i	eu frage
I unoi D LA	Joit and mi	POIL DIVILLE	III IIIGGGGIC	o with a min	an onaic or i	DC Huuc

	Ove	rdrafts	1	oans
Application date	Export	Import	Export	Import
2011	2port	Import		p 0.10
2012				
2013				
2014	-0.0354** (0.0154)	-0.0481*** (0.0177)		
2015	-0.0411** (0.0162)	-0.0529*** (0.0194)	-0.1006* (0.0518)	-0.0856** (0.0400)
2016	(0.0102)	-0.0546** (0.0223)	(0.0310)	(0.0100)
2017		-0.0763*** (0.0244)		
Control variables	Yes	Yes	Yes	Yes
No. of obs	539	1377	306	753
Wald test statistics	4.30***	6.17***	3.42***	4.70***
McFadden's pseudo R2	0.2156	0.1687	0.2479	0.1841

Notes: The table only reports the estimated marginal effects of significant coefficients of application date after variable selection. Pooled standard errors are in parentheses. The dependent variable is whether an overdraft or a loan application is rejected or not. The industries with a high share of EU trade are given in Appendix A2. The results for control variables are not reported for brevity, but available upon request. The null hypothesis of the Wald test is that all coefficients, excluding the constant term, are equal to zero simultaneously. *, ***, **** indicate significance at 10%, 5% and 1% level, respectively.

Table 7

Bank debt rejection by firm size: logistic model

Medium
Yes
351
3.49**
0.0286

Notes: The table only reports the estimated marginal effects of significant coefficients of application date after variable selection. Pooled standard errors are in parentheses. The dependent variable is whether an overdraft or a loan application is rejected or not. Firms with 0-9 employees and less than £2m annual turnover are defined as micro firms. Firms with 10-49 employees and £2m-10m annual turnover are defined as small firms. Firms with 50-249 employees and £10m-25m annual turnover are defined as medium-sized firms. Firms with missing turnover are defined according to the number of employees only. The results for control variables are not reported for brevity, but available upon request. The null hypothesis of the Wald test is that all coefficients, excluding the constant term, are equal to zero simultaneously. *, ***, **** indicate significance at 10%, 5% and 1% level, respectively.

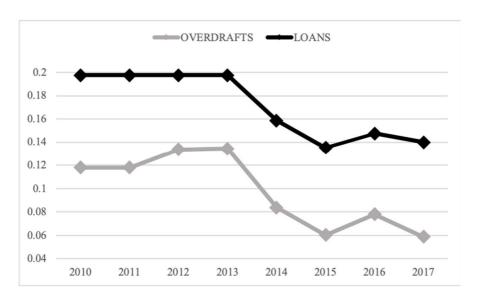
Table 8
Bank debt rejection by firm age: logistic model

		Overdrafts		
Start up	Young	Mature	- of which	
(<2 years)	(2-5 years)	(>5 years)	(6-9 years)	(>10 years)
0.2005***	-	-0.0159*	•	
(0.0545)		(0.0081)		
0.2092***	0.0379*	,		
(0.0545)	(0.0231)			
0.2928***	, ,			
(0.0587)				
,		-0.0468***	-0.0532***	-0.0425***
		(0.0097)	(0.0176)	(0.0123)
		-0.0663***	, ,	-0.0815***
		(0.0107)		(0.0136)
		, ,	, ,	-0.0633***
				(0.0149)
	-0.0675**			-0.0751***
				(0.0162)
Yes	,	,	, ,	Yes
				7659
				11.55***
				0.0968
0.12)1	0.0072	0.1020	0.1005	0.000
		Loans		
Start up	Young	Mature	- of which	
(<2 years)	(2-5 years)	(>5 years)	(6-9 years)	(>10 years)
			0.0595**	
			(0.0274)	
0.1783***			0.0975**	
(0.0668)				
(0.0000)			(0.0377)	
(0.0000)			(0.0377) 0.0883**	
(0.0000)			,	
(0.0000)		-0.0394***	0.0883**	-0.0585***
(0.0000)		-0.0394*** (0.0126)	0.0883** (0.0351)	-0.0585*** (0.0166)
(0.0000)			0.0883** (0.0351) 0.0581**	
(0.0000)		(0.0126)	0.0883** (0.0351) 0.0581**	(0.0166)
(0.0000)		(0.0126) -0.0566***	0.0883** (0.0351) 0.0581**	(0.0166) -0.0576***
(0.000)		(0.0126) -0.0566*** (0.0137)	0.0883** (0.0351) 0.0581** (0.0293)	(0.0166) -0.0576*** (0.0187)
(0.0000)		(0.0126) -0.0566*** (0.0137) -0.0578***	0.0883** (0.0351) 0.0581** (0.0293) 0.1251**	(0.0166) -0.0576*** (0.0187) -0.0854***
(0.000)		(0.0126) -0.0566*** (0.0137) -0.0578*** (0.0158)	0.0883** (0.0351) 0.0581** (0.0293) 0.1251**	(0.0166) -0.0576*** (0.0187) -0.0854*** (0.0207)
Yes	Yes	(0.0126) -0.0566*** (0.0137) -0.0578*** (0.0158) -0.0635***	0.0883** (0.0351) 0.0581** (0.0293) 0.1251**	(0.0166) -0.0576*** (0.0187) -0.0854*** (0.0207) -0.0675***
	Yes 662	(0.0126) -0.0566*** (0.0137) -0.0578*** (0.0158) -0.0635*** (0.0179)	0.0883** (0.0351) 0.0581** (0.0293) 0.1251** (0.0543)	(0.0166) -0.0576*** (0.0187) -0.0854*** (0.0207) -0.0675*** (0.0243)
Yes		(0.0126) -0.0566*** (0.0137) -0.0578*** (0.0158) -0.0635*** (0.0179) Yes	0.0883** (0.0351) 0.0581** (0.0293) 0.1251** (0.0543)	(0.0166) -0.0576*** (0.0187) -0.0854*** (0.0207) -0.0675*** (0.0243) Yes
	(<2 years) 0.2005*** (0.0545) 0.2092*** (0.0545) 0.2928*** (0.0587) Yes 681 5.97*** 0.1291 Start up (<2 years)	(<2 years) (2-5 years) 0.2005*** (0.0545) 0.2092*** (0.0545) (0.0231) 0.2928*** (0.0587) -0.0675** (0.0302) Yes 681 1109 5.97*** 0.1291 Start up (<2 years) Young (<2 years) 0.1783***	Start up (<2 years) Young (2-5 years) Mature (>5 years) 0.2005*** (0.0545) (0.00545) (0.00545) (0.00587) -0.0159* (0.0081) 0.2928*** (0.0587) -0.0468*** (0.0097) -0.0663*** (0.0107) -0.0543*** (0.0114) -0.0675** (0.0302) Yes 681 1109 8883 5.97*** 0.1291 Yes 681 15.34*** 0.1291 Start up (<2 years)	Start up (<2 years) Young (2-5 years) Mature (>5 years) - of which (6-9 years) 0.2005*** -0.0159* (0.0545) (0.0081) 0.292*** (0.0231) 0.2928*** (0.0097) (0.0587) -0.0468*** -0.0663*** -0.0317* (0.0107) (0.0168) -0.0543*** -0.0333* (0.0114) (0.0188) -0.0675** -0.0657*** -0.0502** (0.0302) (0.0125) (0.0210) Yes Yes Yes 681 1109 8883 1224 5.97*** 5.22*** 15.34*** 6.08*** 0.1291 0.0695 0.1020 0.1065 Loans Loans Start up (Young (5.9 years) (6-9 years) (<2 years)

Notes: The table only reports the estimated marginal effects of significant coefficients of application date after variable selection. Pooled standard errors are in parentheses. The dependent variable is whether an overdraft or a loan application is rejected or not. The results for control variables are not reported for brevity, but available upon request. The null hypothesis of the Wald test is that all coefficients, excluding the constant term, are equal to zero simultaneously. *, **, *** indicate significance at 10%, 5% and 1% level, respectively.

Figure 1

Predicted probability of bank debt rejection by sub-periods



Source: SME Finance Monitor (SMEFM) and authors' calculations.

Appendix Table A1

Number of observations and sample size by survey wave

		Total abanmustions	Sample size	
		Total observations	Overdrafts	Loans
Wave 1	2011 Q1Q2	5063	874	407
Wave 2	2011 Q3	5055	691	332
Wave 3	2011 Q4	5010	533	
Wave 4	2012 Q1	5023	594	325
Wave 5	2012 Q2	5000	598	297
Wave 6	2012 Q3	5032	499	256
Wave 7	2012 Q4	5000	430	218
Wave 8	2013 Q1	5000	484	233
Wave 9	2013 Q2	5000	417	220
Wave 10	2013 Q3	5008	437	227
Wave 11	2013 Q4	5028	444	234
Wave 12	2014 Q1	5000	353	230
Wave 13	2014 Q2	5008	354	191
Wave 14	2014 Q3	5023	451	294
Wave 15	2014 Q4	5024	350	215
Wave 16	2015 Q1	5038	358	246
Wave 17	2015 Q2	5001	329	194
Wave 18	2015 Q3	5004	314	205
Wave 19	2015 Q4	5003	358	
Wave 20	2016 Q1	4500	275	158
Wave 21	2016 Q2	4500	234	
Wave 22	2016 Q3	4500	234 160	
Wave 23	2016 Q4	4500	158	118
Wave 24	2017 Q1	4500	199	102
Wave 25	2017 Q2	4507	256	127
Wave 26	2017 Q3	4505	240	106
Wave 27	2017 Q4	4500	283	170
	Гotal	131332	10673	5864

Appendix Table A2

UK trade by industry and region in 2016-2017

D 11 D 1 (1 0 m)		2016			2017		
Panel A Exports (in £ million)	EU	Total		EU	Total		-
Construction	946	1955	48%	742	1366	54%	
Agriculture, hunting and forestry fishing	641	995	64%	787	1261	62%	High
Health and social work	86	168	51%	39	93	42%	
Hotels and restaurants	6690	13705	49%	7121	14767	48%	High
Manufacturing	78024	183064	43%	93665	210813	44%	High
Real estate, renting and business activities	16746	51954	32%	19781	58716	34%	
Transport, storage and communication	40881	95523	43%	44448	104664	42%	
Wholesale/retail	60878	99683	61%	66583	107979	62%	High
Other community, social and personal service	3941	10490	38%	4979	12116	41%	
Total	208833	457537	46%	238145	511775	47%	
D 101							
Danal D Imports (in C million)		2016			2017		
Panel B Imports (in £ million)	EU	2016 Total		EU	2017 Total		-
Panel B Imports (in £ million) Construction	EU 2731		74%	EU 2972		78%	High
		Total	74% 73%		Total	78% 74%	High High
Construction	2731	Total 3715		2972	Total 3791		
Construction Agriculture, hunting and forestry fishing	2731 663	Total 3715 905	73%	2972 767	Total 3791 1036	74%	High
Construction Agriculture, hunting and forestry fishing Health and social work	2731 663 100	Total 3715 905 134	73% 75%	2972 767 121	Total 3791 1036 138	74% 88%	High
Construction Agriculture, hunting and forestry fishing Health and social work Hotels and restaurants	2731 663 100 280	Total 3715 905 134 688	73% 75% 41%	2972 767 121 292	Total 3791 1036 138 601	74% 88% 49%	High High
Construction Agriculture, hunting and forestry fishing Health and social work Hotels and restaurants Manufacturing	2731 663 100 280 75414	Total 3715 905 134 688 138422	73% 75% 41% 54%	2972 767 121 292 87943	Total 3791 1036 138 601 166921	74% 88% 49% 53%	High High
Construction Agriculture, hunting and forestry fishing Health and social work Hotels and restaurants Manufacturing Real estate, renting and business activities	2731 663 100 280 75414 11285	Total 3715 905 134 688 138422 24047	73% 75% 41% 54% 47%	2972 767 121 292 87943 9692	Total 3791 1036 138 601 166921 23389	74% 88% 49% 53% 41%	High High
Construction Agriculture, hunting and forestry fishing Health and social work Hotels and restaurants Manufacturing Real estate, renting and business activities Transport, storage and communication	2731 663 100 280 75414 11285 36313	Total 3715 905 134 688 138422 24047 76737	73% 75% 41% 54% 47%	2972 767 121 292 87943 9692 35315	Total 3791 1036 138 601 166921 23389 75946	74% 88% 49% 53% 41% 47%	High High High

Notes: The industrial classifications in our sample (the International Standard Industrial Classification of All Economic Activities Rev.3) are matched with those in the trade data (the Standard Industrial Classification 2007). The reported trade data are obtained by summing up the UK trade in goods and services. Industries with an above-average share of EU trade in both 2016 and 2017 are identified as "High" in the last column.

Sources: Office for National Statistics and author's calculations; (i) Exports: UK Trade in Goods by industry, country and commodity, 2008-2017; (ii) Imports: UK Trade in Goods by industry, country and commodity, 2008-2017; (iii) Exports: UK Trade in Services by industry, country and service type, 2016-2017; (iv) Imports: UK Trade in Services by industry, country and service type, 2016-2017.

Appendix Table A3

Robustness check

	Overd	Overdrafts		Loans	
Panel A Excluding applications	in 2010 and 2017				
Application date					
Applications in 2012	0.1710**	(0.0855)			
Applications in 2013	0.1657*	(0.0909)			
Applications in 2014	-0.3836***	(0.1081)	-0.3002***	(0.1108)	
Applications in 2015	-0.7701***	(0.1287)	-0.5052***	(0.1298)	
Applications in 2016	-0.5230***	(0.1504)	-0.2915*	(0.1567)	
Control variables	Ye	es	Ye	S	
No. of observations	882	8828		0	
Wald test statistics	26.62	26.62***		***	
McFadden's pseudo R ²	0.17	27	0.1706		
Panel B Ordered logistic model	I				
Application date					
Applications in 2011	0.1.4204	(0.0705)			
Applications in 2012	0.1439*	(0.0785)			
Applications in 2013	0.1559*	(0.0838)	0. 25 5 2 de de de de	(0.1016)	
Applications in 2014	-0.3942***	(0.1009)	-0.2753***	(0.1016)	
Applications in 2015	-0.7393***	(0.1211)	-0.4729***	(0.1191)	
Applications in 2016	-0.4551***	(0.1416)	-0.3731***	(0.1432)	
Applications in 2017	-0.7400***	(0.1754)	-0.3993**	(0.1783)	
Control variables	Ye		Ye		
Cut-off point (0/1)	-0.4475*	(0.2474)	-0.6633***	(0.1556)	
Cut-off point (1/2)	0.1786	(0.2472)	-0.2174	(0.1552)	
No. of observations	106		5864		
Wald test statistics	30.80		22.29***		
McFadden's pseudo R ²	0.14	-61	0.1375		
Panel C Selected independent v	ariables with no simult	aneity bias			
Application date					
Applications in 2011	0.1200*	(0.0710)			
Applications in 2012	0.1208*	(0.0718)			
Applications in 2013	0.501(***	(0.0051)		(0.1001)	
Applications in 2014	-0.5016***	(0.0951)	- 0.2505***	(0.1001)	
A 11 2015	0.0005***	(0.1146)	0.3595***	(0.11(7)	
Applications in 2015	-0.8985***	(0.1146)	- 0	(0.1167)	
	0.701.71646	(0.1220)	0.6134***	(0.1.100)	
Applications in 2016	-0.7217***	(0.1328)	- 0	(0.1400)	
	4.06=0.000	(0.46=0)	0.5406***	(0.4554)	
Applications in 2017	-1.0678***	(0.1673)	-	(0.1751)	
			0.6498***		
Control variables		Yes		S	
No. of observations	10673 5864				
Wald test statistics	44.44		27.55***		
McFadden's pseudo R ²	0.13	97	0.12	36	

Panel D Applicants surveyed and applying in the same quarter						
Application date						
Applications in 2011						
Applications in 2012			0.5075**	(0.2092)		
Applications in 2013			0.6401***	(0.2355)		
Applications in 2014	-0.5171**	(0.2363)				
Applications in 2015	-0.5889**	(0.2492)				
Applications in 2016	-0.7582**	(0.3666)				
Applications in 2017	-0.7792**	(0.3591)				
Control variables	Yes		Yes			
No. of observations	1842		887			
Wald test statistics	11.93***		8.87***			
McFadden's pseudo R ²	0.213	32	0.16	19		

Notes: The table only reports the significant estimated coefficients of application date after variable selection. Pooled standard errors are in parentheses. The dependent variable is whether an overdraft or a loan application is rejected or not in Panel A, C and D. In Panel B, the dependent variable is an ordinal variable equal 0 when an overdraft or a loan application is approved, 1 when an overdraft or a loan applicant receives less credit than it requests and 2 when an overdraft or a loan application is turned down outright. The results for control variables are not reported for brevity, but available upon request. The null hypothesis of the Wald test is that all coefficients, excluding the constant term, are equal to zero simultaneously. *, ***, *** indicate significance at 10%, 5% and 1% level, respectively.