

**CENTRE *for* ECONOMIC
P E R F O R M A N C E**

CEP Discussion Paper No 652

September 2004

Labor Market Institutions, Wages and Investment

Jörn-Steffen Pischke

Abstract

Labor market institutions, via their effect on the wage structure, affect the investment decisions of firms in labor markets with frictions. This observation helps explain rising wage inequality in the US, but a relatively stable wage structure in Europe in the 1980s. These different trends are the result of different investment decisions by firms for the jobs typically held by less skilled workers. Firms in Europe have more incentives to invest in less skilled workers, because minimum wages or union contracts mandate that relatively high wages have to be paid to these workers. I report some empirical evidence for investments in training and physical capital across the Atlantic, which is roughly in line with this theoretical reasoning.

Keywords: Frictional labor markets, human capital, changes in wage inequality

JEL codes: E22, E24, J23, J24, J31

This paper was produced as part of the Centre's Labour Markets Programme. The Centre for Economic Performance is financed by the Economic and Social Research Council.

Acknowledgements

This paper was prepared for the CESifo Area Conference Employment and Social Protection in Munich on June 11-12, 2004 and draws heavily on my previous work in this area. I thank Daron Acemoglu, Francesco Caselli, Jason Cummins, and the conference participants for helpful comments and the Economic and Social Research Council (Grant RES-000-22-01-0160) for financial support. This paper was written while I was visiting the NBER in Cambridge, and I thank them for their hospitality. Some of the data used in this paper have been obtained from the German Zentralarchiv für Empirische Sozialforschung at the University of Köln (ZA). Neither the producers of the data nor the ZA bear any responsibility for the analysis and interpretation of the data in this paper.

Published by
Centre for Economic Performance
London School of Economics and Political Science
Houghton Street
London WC2A 2AE

All rights reserved. No part of this publication may be reproduced, stored in a retrieval system or transmitted in any form or by any means without the prior permission in writing of the publisher nor be issued to the public or circulated in any form other than that in which it is published.

Requests for permission to reproduce any article or part of the Working Paper should be sent to the editor at the above address.

© J-S. Pischke, submitted 2004

ISBN 0 7530 1782 2

1 Introduction

Labor market institutions affect the outcomes of workers in a variety of ways. Many of these institutions are related to the wage setting process, and hence influence the wages paid to workers directly. But even institutions like unemployment insurance or employment protection will affect wages indirectly, because they change workers' bargaining power in the wage setting process. The wages actually set will in turn influence the hiring decisions of firms, and hence employment outcomes. There is a vast literature studying these issues, both theoretically and empirically.

In this paper, I will focus on a more indirect impact of labor market institutions, and of the resulting wage structure, namely their effect on investment decisions made by firms. These decisions to invest in training of the work force and physical capital will change the productivities of workers, and hence also influence wage and employment outcomes. I will focus on a particular premise: frictions in the labor market are important, so that these markets deviate from the competitive benchmark. These frictions will lead to rents for the firms. Labor market institutions distort the wage structure, and hence the amount of employment rents firms earn from workers with different productivities. This in turn will influence the decisions of firms as to what investment to make in particular workers or jobs. Because labor market institutions, and hence the wage structure, are so different in Anglo Saxon and continental European countries, this story helps us understand the different evolutions of the labor markets in these countries, as I will argue.

The discussion in this paper will draw heavily on work which Daron Acemoglu and I, as well as others, have done in order to understand the financing of on-the-job training. The traditional framework for human capital investment implies that workers will pay for skills which are transferable between employers, and reap the full rewards of this investment. In a series of papers (Acemoglu and Pischke 1998; 1999a; b), we have shown that this may not be true in frictional labor markets. I will start in the next section by reviewing the key theoretical arguments for why frictions and the wage structure matter for human capital investment decisions.

In section 3, I will argue that a better understanding of the investment behavior of firms might help us better understand the differential evolution of labor markets across the Atlantic during the past two decades. In a nutshell, wage inequality has increased dramatically in the US, and to some extent in Canada and the UK. Wage inequality has remained more or less constant in continental Europe but unemployment has risen sharply during this period. The standard explanation for the trend in wage inequality in the US is skill biased technical change, globalization, or some combination of these. However, these same trends should have impacted Europe in a rather similar way. An attractive hypothesis, often labeled the “Krugman hypothesis” (Krugman 1994) links the differential developments to labor market institutions. While both continents were hit by the same shock, labor market institutions in Europe have protected the wages of low skilled workers but led to higher unemployment.

Unfortunately, the empirical evidence does not seem to support the Krugman hypothesis. It implies that employment should have collapsed in Europe for low skilled workers only. Instead the data show employment trends which are far too uniform across skill groups. However, the model of human capital investment in frictional labor markets has important implications for the evolution of investment choices made by firms. In particular, if workers cannot make their own human capital investments, it implies that firms will invest less in low skilled workers in the US and more in continental Europe. The same argument can easily be extended to physical capital investment (see Acemoglu 2003). Hence, differential investments by skill group might have altered the relative productivities of workers in different countries in a way to lead to the different labor market outcomes we observe for the 1980s.

This suggests that understanding the investment behavior of firms in the face of labor market imperfections might be an important ingredient in understanding the behavior of labor markets. The story I have outlined above also seems like an attractive alternative to the Krugman hypothesis, given the observed employment trends. Nevertheless, this still leaves open the question whether the alternative explanation is of any more relevance empirically.

I will address this issue in section 4 of the paper. I will first review some of the evidence, which links labor market institutions and training outcomes directly. I will then go on and present some evidence for the evolution of training in the US and Germany. However, data on human capital investment is highly imperfect, and no comparable data across countries is available for this exercise. I will therefore also present some new evidence on investment in physical capital and on labor productivity growth. The evidence on investment is generally more favorable to the story I outlined than the findings on productivity growth.

The big question arising from all this is, of course, what it means for labor market reform in Europe. This is a difficult question, and I believe that we know far too little empirically of what exact model of investment is correct to be able to answer it at this stage. Nevertheless, I offer some suggestions in the conclusion, and point out where more research is needed.

2 Training in Imperfect Labor Markets

The standard neoclassical model of human capital investment due to Becker (1964) assumes that labor markets are perfectly competitive. In this case, workers will be paid according to their marginal product, and firms do not receive any rents from the employment relationship. If skills are general, i.e. perfectly transferable from one employer to the next, then firms cannot finance any of the human capital investment directly because they would never be able to recoup any of their investment. Hence, all investment has to be financed by the worker. This may happen implicitly, through lower wages earned during the training period to reimburse the firm for any outlays. As long as wages are flexible, and workers have the resources to finance the investment, their training choices should be made optimally, and there is no role for government intervention in the market for human capital.

Things may be different when labor markets are imperfect, as studied in detail in Acemoglu and Pischke (1999a; b). Figure 1 explains the key argument. t denotes the

level of training or skill of a worker. $f(t)$ denotes productivity (marginal product), which rises with t . In the absence of labor market imperfections, the wage would be equal to $f(t)$. Frictions in the labor market imply that wages are lower than $f(t)$, for example like $w(t)$ in the figure. The firm earns a rent $f(t) - w(t)$ from the employment relationship. The way the figure is drawn, this rent is independent of t . In the absence of any labor market institutions impacting the wage structure, the firm still has no incentive to pay for the training of its worker, although it could now possibly finance such training out of the employment rent. Nevertheless, this rent is the same at all skill levels, so the firm will prefer an unskilled worker, which is available at zero training cost.

Now suppose there is a government or union imposed minimum wage, denoted w_{min} in the figure. The wage the firm now has to pay is w_{min} for all workers with training level below t_0 , and it is still $w(t)$ for skill levels above that. The way the figure is drawn, the firm would now actually make a loss from a worker who is completely unskilled ($t = 0$) because the minimum wage is above the productivity level of this worker. In a competitive labor market the firm would have no choice but to lay off the worker. In a frictional labor market, the firm has another choice, however. By giving the workers some training, it can restore its employment rent. This is the case for any training level of t_0 and above. Of course, training is costly for the firm, and the training cost is denoted by $c(t)$ in the figure. Hence, the firm will choose the lowest level of training which gives it $f(t) - w(t)$, which is t_0 , and the firm will now earn $f(t_0) - w(t_0) - c(t_0)$.

This demonstrates how labor market institutions can create an incentive for firms to invest in the skills of their workers. Strictly speaking, labor market institutions are not really necessary for this argument, although the example of a minimum wage highlights the workings of the model nicely. However, what is necessary for firms to invest is simply that the wage structure $w(t)$ is compressed, i.e. that $w(t)$ is flatter than $f(t)$. If this is the case, then the rents the firm can earn from more skilled workers will be greater than the rents earned from less skilled workers. Hence, it may invest in training. Such a compression of the wage structure may come about for a variety of reasons, many linked to the natural operation of the labor market, like search and bargaining, information

asymmetries, complementarities with firm specific skills, etc. (see Acemoglu and Pischke 1999a; b for the details).

So far, I have only demonstrated that firms have an incentive to invest in the training of their workers, even when the skill is easily transferable to another employer. However, workers may also want to invest in their own skills: the traditional Becker mechanism. Hence, depending on the contract between the worker and firm, it could be either the worker or the firm, who makes the investment, or the investment could be shared by both parties. All we can say is that firms will bear the full investment cost when workers cannot contribute to the investment at all. This may happen if workers are credit constrained so they are unable to bear the upfront costs, or if it is impossible to write contracts over the training to be provided by the firm, if the worker pays the firm upfront. These considerations are likely to be important for at least some workers, and hence at least some human capital investments should be made by firms in practice.

If this is the case, the implication of the theory is that training investments should go up when wage compression, the slope of $w(t)$ relative to $f(t)$, increases. This can easily be seen in figure 1 again by returning to the example of a minimum wage. If the minimum wage is higher, it will intersect $w(t)$ at a higher training level, which will be the training level chosen by the firm (as long as $c(t) < f(t) - w(t)$).

3 The Evolution of Wage Inequality, Employment, and the Role of Investment

I will now turn to the question whether the framework outlined in the previous section can help us understand the evolution of labor markets in the US and Europe in the past two decades. Wage inequality has increased sharply in the US during this period. This increase was concentrated in the 1980s, while wage inequality in the 1990s remained relatively stable (see Card and DiNardo 2002; Lemieux 2003). Table 1 presents some data on the evolution of wage inequality in a number of selected OECD countries, focusing on the period from 1980 to 1990. The data are taken from the OECD Employment Outlook 1996 (OECD 1996) and refer to the change in the ratio of the 90th

and 10th percentile of the wage distribution during the decade. The table shows that wage inequality increased dramatically in the US but remained stable or fell in continental European countries. Canada and the UK also saw rising wage inequality in these data, but by less than the US.

The standard explanation for increasing wage inequality in the US is skilled biased technical change (see Acemoglu 2002 for a recent survey, and Card and DiNardo 2002 for a critical view). According to this hypothesis, technological developments (or deliberate decisions by firms) lead to investments which were complementary with more skilled workers (or more so than in previous decades). This raised the wages of more skilled workers, while depressing the wages of less skilled workers.

A challenge for this hypothesis is to explain why trends in wage inequality were so different in Europe, when technological developments should be fairly much the same across most OECD countries. Labor market institutions are a possible explanation, as first noted by Krugman (1994), Freeman (1995) and others. Figure 2 illustrates the argument. This is a standard labor supply–labor demand diagram with relative wages of more and less skilled workers on the vertical axis and relative employment of more and less skilled workers on the horizontal axis. The downward sloping line is relative labor demand. Relative labor supply is probably comparatively inelastic in the short run, and is hence drawn as a vertical line. The intersection yields relative wages and employment at the beginning of the period, i.e. around 1980. Skill biased technical change implies that relative labor demand shifted out. In the US, this implies an increase in wage differentials and little change in relative employment. In Europe, in contrast, labor market institutions prevent wage inequality from rising. This is denoted by the flat wage setting schedule in the graph. It implies that there is gap between relative supply and demand in Europe at the prevailing relative wage, denoting relative unemployment. A simple version of this story there would be full employment of skilled workers and the relative unemployment would imply unemployment among unskilled workers in Europe. Unemployment has indeed increased dramatically in Europe during this period, and table 1 provides some data for the selected countries.

While this hypothesis is simple and appealing, the problem is that it implies a gap in relative unemployment or employment rates in Europe, not simply an increase in unemployment. Nickell and Bell (1995; 1996) first demonstrated that relative unemployment rates by skill increased far too uniformly in Europe to be consistent with this story. The problem with looking at unemployment rates is that it is not completely clear whether one should look ratios or differences of unemployment rates by skill group. Unfortunately, which way the analysis is done often matters because unemployment rates for the skilled are relatively low and unemployment rates for the unskilled are much higher. This problem can be avoided by looking at employment rates, an exercise first undertaken by Card, Kramarz, and Lemieux (1999) for the US, Canada, and France. If the Krugman hypothesis is correct, employment trends for different skill groups should be roughly the same in the US, while employment of the unskilled should have fallen (or risen less) in France. Canada should occupy an intermediate position. Instead, employment trends are virtually indistinguishable across the three countries.

Krueger and Pischke (1998) have repeated this exercise for the US and Germany, and I present our results in figures 3 and 4. For this analysis, individuals have been grouped into 20 groups by age and education. For each group, the change in wages between 1979 and 1991 is shown as a square and the change in employment rates is shown as a circle. These changes are plotted against the mean wage for the group in 1979 as a measure of the skill level of the group. Figure 3 demonstrates that wages for the more skilled increased at a much faster rate than those for the less skilled. Employment fell for the less skilled over the period and showed little change for the more skilled. Figure 4 shows the same picture for Germany. There is little relationship between wage growth and the skill level of the group. The same is true for employment growth. If the Krugman hypothesis was correct, we ought to see a strongly upward sloping relationship between employment growth and initial wages for Germany, but this relationship looks, if anything, flatter than for the US.

How can the framework of human capital investment in imperfect labor markets with rents help us to understand these trends? The first observation to make is that it might imply that the baseline human capital level for the least skilled workers is higher in

Europe than in the US. If credit constraints are important for these types of workers, then they may have difficulties in financing schooling or training in the US. In Europe, on the other hand, this might imply that firms do (some of) the investing, and hence these workers still get some skills. Many authors (Nickell and Bell 1996; Freeman and Schettkat 2001; Blau and Kahn 2001) have noted that low skilled workers in Europe tend to be more skilled than low skilled workers in the US, although some of these differences may stem from differences in the school systems. If the US and Europe are now hit by the same relative labor demand shock which is unfavorable to low skilled workers, this will imply that there is a much larger mass of workers to be affected in the US than in Europe. Hence, we ought to see much less in terms of an increase in relative wage inequality in Europe in response to the same shock.

In order to see this more formally, return to the setup in figure 1 which is reproduced in figure 5. Skill biased technical change implies that the schedule $f(t)$, which denotes the worker's productivity level, becomes steeper. This is depicted by the two schedules labeled "1980" and "1990" in the figure. If there is a minimum wage in Europe but labor markets are otherwise perfect, this shift may imply some additional loss of employment for relatively low skilled workers. If there are employment rents on the other hand, firms have an incentive to provide enough training for workers to have at least skill level t_0 . There will be no workers in Europe with skills below this level, and hence we may not see any relative employment declines for this group.

The second point is that skill biased technical change coupled with relative wage rigidity in Europe may imply changes in relative investment incentives. In order to see this, consult figure 5 again. Our assumption is that labor markets in the US are relatively flexible. For simplicity, assume that wages in the US are equal to $f(t)$. In Europe, wages are given by $w(t)$, possibly coupled with a minimum wage but the wage schedule is the same in 1990 as in 1980. As skill biased technical change takes place, wages change according to the rotation of the $f(t)$ schedule in the US. Because workers make all the investment in the US labor market, their incentive to invest has now increased. But if workers are credit constraint, they may not be able to make additional investments. In Europe, the change in productivities is also given by the two $f(t)$ -schedules. Because the

wage schedule is unchanged, this means that the incentives for the firm to invest in training have increased in Europe. Hence, if workers are credit constrained, investment in training in Europe may have increased.

Note that this argument only works if workers are credit constrained, and hence firms make the investment. The same reasoning can therefore be more straightforwardly applied to physical capital investment, where it is easier to argue that the costs are solely born by the firm. This argument has been laid out in Acemoglu (2003), and can be illustrated most clearly with a numerical example adapted from that paper. Assume that a worker's productivity is 10 in the absence of investment, and 20 after investment. Investment costs 6, and the costs are paid by the firm. Rents are shared in a way so that wages are half of productivity. This means that the firm obtains a profit of 5 without investment, but only 4 if it made the investment ($20 - 10 - 6 = 4$). Hence it will not undertake the investment for this type of worker.

Now assume there is a minimum wage of 7 in place. It is easy to see how this changes the picture. Without the investment, the firm makes a profit of 3 because it has to pay a wage of 7 to a worker with a productivity of 10. If it invests, the minimum wage will no longer bind, and it will still make a profit of 4 as before. Hence, investing is more profitable. The intuition for the result is the exact same as in the training case discussed above: it is the interaction of employment rents and wage compression through the minimum wage which give the firm an incentive to invest.

It is easy to see how this mechanism will modify the outcomes if both the US and Europe are subject to skill biased technological change. Skill biased technical change should be thought of here as a change in the world technology frontier. Firms in each country will then decide which technologies to adopt and which investments to make. Suppose, the costs of investing were only 4 initially, rather than 6. In this case it would always pay for firms to invest in low skilled workers. Now suppose that the 1980s were characterized by technologies which were more costly to implement, and the investment costs now rise to 6. Firms in the US will not adopt the new technologies with low skilled workers anymore, following the reasoning above.

Think of high skilled workers as workers with productivities of 20 without investment and 40 with investment, so that investing is always profitable, and the minimum wage does not affect these workers. In Europe, where minimum wages are in place, firms will make the investment with both high and low skilled workers, before and after the increase in investment costs. Hence, the observed technical change in Europe will be less skill biased than in the US.

This model generates sharply rising wage inequality in the US. In the numerical example, the wages of high skilled relative to low skilled workers will rise from 2 before the new technology is available to 4 after it is available. In Europe, wage differentials will remain constant at 2. The model has other attractive features. Acemoglu (2003) embeds this in a matching model of unemployment. The rising investment costs in the 1980s imply that profits will fall in both the US and Europe, which will reduce job creation and hence raise unemployment. However, profits will fall less in the US (because the European minimum wage leads firms to make suboptimal investment decisions in low skilled workers) than in Europe, so unemployment will rise more in Europe. Moreover, unemployment may rise across the board, rather than just for less skilled workers, if there are some complementarities in the creation of skilled and unskilled jobs.

4 What is the Empirical Evidence?

I have argued above that the wage structure, and hence labor market institutions, affect the investment behavior of firms. Understanding how wages affect the investment behavior of firms, in turn, helps us understand the evolutions of relative wages and employment in Europe and the US during the past two decades. The story is attractive, because it fits the facts on wage inequality and employment or unemployment better than previous explanations. However, the question remains: is this the correct explanation?

In order to take a stab at answering this question, we need some direct empirical evidence on the investment behavior of firms in the US and Europe, and how this investment

behavior changed during the 1980s. In this section, I will present a few pieces of evidence. I will start by reviewing some direct tests of the model of training investment presented in section 2. I will then go on and present some evidence on changes in training levels during the 1980s. However, comparable data on training levels over time and across countries are difficult to obtain, so this comparison will be limited to the US and Germany. In order to present some evidence for a variety of countries, I will close with some results on investment in physical capital. Neither piece of evidence by itself is necessarily very conclusive, but taken together, the evidence clearly supports the story outlined above.

In order to test the model of training in imperfect labor markets with wage compression against the more standard human capital theory, it is necessary to observe a change in the wage structure while marginal products are unchanged, or vice versa. This is a difficult task. In Acemoglu and Pischke (2003), we have argued that changes in the minimum wage provide a suitable example: there is no reason to expect that a change in a government mandated minimum wage coincides with changes in relative productivities. The starkest versions of the standard human capital model and the imperfect labor markets model with credit constrained workers have opposite implications in this case: in the former case an increase of the minimum wage should lead to less training, in the latter case to more training. Moreover, the effects of minimum wages on training are also of direct policy interest.

In Acemoglu and Pischke (2003), we estimate the effect of changes in state and federal minimum wages on training during the period 1987 to 1992 in the US by comparing workers in different states. We find very little effect. We attribute this result to the possibility that training investments may be governed by a hybrid model where some training is financed by workers, and some is financed by firms. We find some weak support for this idea by linking the response of training to minimum wages to differences in labor market rents across industries. Arulampalam, Booth, and Bryan (2002) carry out a similar exercise for Britain, studying the impact of the introduction of the national minimum wage in 1999. They compare lower and higher wage workers before and after the introduction of the minimum wage and find positive effects on training. They also try

to link the response of training to labor market rents, but do not find the same relationship across industries as we did for the US. However, they find the expected relationship when comparing labor markets of different sizes.

While these results provide some support for the imperfect labor market model of training, there are other studies, which find more negative results. Neumark and Wascher (2001) also analyze state and federal minimum wage changes in the US using different data and a somewhat different methodology and find strongly negative effects of minimum wages on training. Other studies have used a different methodology, and compared cross sections of workers rather than differences over time. It is difficult to argue that the precondition for testing the model, holding marginal products constant across the treatment and control groups, are satisfied in this case.

Other approaches to testing training models with imperfect labor markets have relied on more explicit mechanisms for wage compression. In Acemoglu and Pischke (1998), we tested a model where wage compression resulted from superior information of training firms about the ability of their trainees compared to other firms in the market. We found some support for implications of this model using data on German apprentices. These results have been corroborated with a much bigger data set by Dustmann and Schönberg (2004). They focus on an alternative model, where union wage setting induces training by firms. They demonstrate that this model has similar implications to ours, and they find additional evidence linking training to unionization.

In summary, there is some, although not unequivocal, support for the idea that labor market institutions may induce training investments by firms. Does this mean the model helps us understand the evolution of wage inequality during the 1980s? In order to address this question, I have assembled some data on on-the-job training in the US and Germany during this decade in Pischke (1998). The results are reproduced in table 2. The table shows the incidence of training in firms at the beginning and end of the decade. The training incidence across countries is not directly comparable, because the relevant questions in the respective surveys differ.

There is little evidence from the data in table 2 that training incidence has risen over the 1980s in the US, although there might have been a slight increase of some types of training for more educated workers. However, training incidence seems to have fallen for the least educated. This is inconsistent with the standard human capital model in the face of skill biased technical change. The data therefore suggest that credit constraints of low education workers may play some role, and prevent these workers from paying for some training. The picture is different for Germany, where training of both low and high education workers increased. This is consistent with the model of training in imperfect labor markets if firms invest. Nevertheless, these differences in training are unlikely to be large enough to explain the differential evolution in wages across the US and Europe by themselves.

I therefore turn to investment in physical capital. Recall from the discussion in the previous section that the model suggests that investment complementary to low skill jobs fell in the US compared to Europe during the 1980s. Investment in high skilled jobs, on the other hand, should have grown at similar rates. It is difficult to link investment data directly to the skill level of workers. In order to do this, I utilize data on investment by industry from the OECD STAN database for Industrial Analysis (OECD 2004). I use 18 industries, and assign them the average skill level of the workers (based on the education level of workers in the US). The industry mix and the capital intensity of industries will differ across countries even in the 1970s. Hence, there is little point in comparing the levels of investment. Instead, using the real investment series from the STAN database, I calculate investment growth from 1980 to 1990 by industry. This is appealing, because there is no need to convert the investment series to a common currency.

In order to relate the evolution of investment to the skill levels of workers, I regress the growth in investment on the skill level in the industry for each country according to the model:

$$\text{ginv8090}_{ic} = \alpha_c + \beta_c \text{aveduc80}_{iUS} + \varepsilon_{ic} \quad (1)$$

where ginv8090_{ic} is the growth in investment from 1980 to 1990 in industry i and country c , aveduc80_{iUS} is the average education level of workers in the industry in the US, ε_{ic} is a

random term, and α_c and β_c are coefficients to be estimated for each country. A similar exercise has been previously performed for US industries by Caselli (1999). The interesting aspect of this exercise is, however, to extend it to multiple countries with different wage setting institutions. For the 1980 to 1990 period, this can be done for 10 countries (see the data appendix for more details). The coefficients β_c reflect the strength of the association of the skill level in the industry and investment growth.

Investment growth should have been higher for more skilled workers in countries where wage inequality increased a lot, like in the US. Hence, we would expect β_c to be positive in these countries. On the other hand, investment growth should have been more similar across skill groups, and therefore industries, in countries where wage inequality did not rise, as in continental Europe. Hence we would expect to β_c to be close to zero in these countries, or in any case smaller than for the US. Table 1 reports the resulting β_c coefficients and figure 6 plots them against the change in wage inequality in these countries over the period. It can be seen that the US and Canada, the countries with the largest changes in wage inequality, had the strongest relationship between investment growth and skills. For the US, the estimate of β_c is statistically significant, and for Canada marginally so, while these estimates are insignificant for the European countries including Belgium. This suggests that there are basically three distinct data points in the figure: The US, Canada, and the European countries.

An alternative way to carry out this empirical exercise is to pool the data for all the countries and industries, and run the following regression:

$$\text{ginv8090}_{ic} = \alpha_c + \beta_{\text{aveduc80}_{iUS}} * \text{wineq8090}_c + \varepsilon_{ic} \quad (2)$$

where wineq8090_c is the change in wage inequality from 1980 to 1990. This regression combines the two steps of the previous exercise, the country level regressions to derive the coefficients β_c , and the regression of these coefficients on the change in wage inequality, which is implicit in figure 6. The coefficient β now tells us directly the strength of the association of the two variables in figure 6, and is analogous to passing a regression line through this scatter plot. Results for this and related regressions are

displayed in the first row of table 3. The coefficient estimate for β is 0.42 with a standard error of 0.11.¹

One danger in interpreting these results is that the association between investment growth and skill level of the industry may reflect other features of the industries in the different countries, and the association with changes in wage inequality across countries may be purely incidental. In order to probe this issue, I repeat the same exercise for the 1970s, a period when wage inequality changed much less in the US and Canada. Figure 7 plots the results again against the change in wage inequality in the 1980s. We would not expect the points to line up in an upward sloping manner in this case. While Canada still has a somewhat higher association between investment growth and skills than the European countries, this is no longer true for the US. Investment grew at about the same rate in US industries as in Belgium, Norway, and Germany in the 1970s.² The estimate from the regression in equation (2) is now no longer significant.³ This suggests that the pattern in the 1980s is indeed special. US investment shifted more towards high skilled industries during this period, while a similar shift did not happen in European countries. This is exactly what we would expect if labor market institutions and the wage structure affect the investment decisions of firms.⁴ Another caveat is that the result may be special to using the skill levels in US industries. Particularly low skilled industries may have a different composition in Europe. The second row in table 3 demonstrates that all the results are robust to using the German skill distribution instead.

Even physical capital investment does not fully capture all the implications of the theory. For example, skill biased technical change may take the form of workplace reorganization, and this may not be associated directly with actual investment. In order to capture effects of this type, it is possible to look at changes in labor productivity by

¹ The regression coefficient is 0.36 with a standard error of 0.12 if Belgium, which seems to be an outlier, is omitted.

² Caselli (1999) finds the same result for the US when comparing the change in capital-labor ratios between 1960 – 1975 and 1975 – 1990.

³ The result for the 1980s holds up if the sample is limited to the 7 countries for which data are available for the 1970s.

⁴ Of course, it is possible that other forces lead to these results. For example, deregulation might have led to more growth and investment in some sectors in the US (and to some degree in Canada) and if these sectors had above average skill levels, we will find the same pattern of results. Much more research is necessary to distinguish this and other explanations from the interpretation I suggest.

industry. In fact, the evolution of labor productivity will reflect the combined influence of investment in human capital, physical capital, and intangible investments, like workplace reorganization, which also affect productivity. Running regression (2) above with the growth in output per worker as the dependent variable is possible for a set of 9 countries, somewhat different from the one above (see the appendix for details). Unfortunately, the result is not as supportive of the theory in this case: the association is much weaker than in the case of investment growth, and not significant as can be seen in table 3. There is no association if industry fixed effects are added. One possibility why this does not work better with the productivity data is that hours have remained constant in the US, while they have declined in the low skill sectors in European countries. However, hours data is only available for very few countries in the STAN database. This leaves us with a somewhat mixed bag of results: positive findings for the training and investment data, but less confirmation of the theory with the productivity data.

5 Conclusion

I have argued in this paper that understanding the role of labor market institutions for the investment decisions of firms is important to help us understand the differential evolution of labor markets in the past two decades. Labor market frictions, the resulting rents, and wage compression together imply that firms have an incentive to invest more in the training of low skilled workers, and in the physical capital with which these workers work. This in turn has implications for how investment decisions evolve as an outside shock, like skill biased technical change, affects the economy. Economies, where labor market institutions, and hence wage compression, is more important, will generally see relatively more investment by firms in low skilled workers. Economies, where wage compression is absent, will tend to shift investment more towards high skilled workers. I have presented some empirical evidence that this is indeed the case for both on-the-job training and for investment in physical capital.

The investment decisions of firms will feed back into the wage and employment outcomes of workers. Labor market institutions, like unions and minimum wages, which

raise the wages of less skilled workers, are generally thought to imply employment losses for the affected groups, as these workers are priced out of the market. This may not be the case if firms make investments to raise the productivity level of these workers to be commensurate with the required wage. Once an exogenous shock arrives, which threatens the position of less skilled workers, these workers will be much more insulated from the shock in Europe than in the US. Cheaper garments from Malaysia or Mexico becoming available because of increased globalization may have impacted the wages and jobs of textile workers in the US in the 1980s. The impact on textile workers in Europe would have been much less, because the textile industry in Europe was already much more capital and skill intensive, and focusing on higher end apparel. In addition, the shift of investment towards more skilled workers in the US in the 1980s drove the productivities and hence the wages of workers apart. European firms chose different investment patterns during this period, raising the productivities of different types of workers more equally, and hence avoiding large changes in wage inequality.

The story I have told in this paper suggests that European countries have reacted in some ways more favorable to a period of adverse shocks than has the US labor market. Are the institutions, which have been much decried for making the European labor markets sclerotic, possibly a good thing? Drawing this conclusion based on the evidence I have provided would certainly be short sided. Institutions, like minimum wages and unions, which redistribute incomes from firms to workers, will lower the profits of firms. This decreases job creation and therefore raises unemployment. Not surprisingly, high unemployment is the central reason for the attempt of making labor markets more flexible in many European countries.

Labor market institutions redistribute incomes and provide insurance to workers. Labor market reforms therefore face the traditional conundrum: efficiency enhancing reforms will tend to increase inequality. If continental European countries desire a certain level of redistribution, and there is much evidence that they do, they may want to undo the effects of labor market deregulation through other mechanisms, like a more progressive tax structure. This, of course, also has efficiency costs. The optimal package of redistribution may therefore well include some degree of labor market regulation. The

difficult question is which institutions and how much labor market regulation should European countries retain. This is a question the research literature is just beginning to provide some answers to.

The current paper contributes to this debate, because realizing that institutions affect investment behavior alters the equity-efficiency tradeoff. The possibility of investments by firms will tend to undo some, but not all, of the undesirable effects of regulations. Hence, incorporating the investment channel is likely to be an important ingredient in the theoretical modeling when we are trying to address these issues. On the other hand, the empirical evidence on the investment channel is still very sketchy and ambiguous, and we need a much better understanding as to how and why firms make their investment decisions.

Data Appendix

This appendix describes the construction of the data shown in table 1. Data for wage inequality refer to all workers and are taken from 3.1 in the 1996 OECD Employment Outlook. That table reports the ratios of the 90th and 50th as well as the 50th and 10th percentile of the wage distribution, which are used to calculate the ratio of the 90th and 10th percentile. The change in the wage distribution was calculated as the difference in these ratios for 1990 and for 1980. Where data for these years were not available, data for the nearest available year were used; in particular for Belgium: 1986 – 90, Canada: 1981 – 90, West Germany: 1983 – 90, and Italy and Norway: 1980 – 91. In those cases where the period does not refer to exactly ten years, the difference was multiplied by 10/(end year – beginning year). Data for the US are not only reported for all workers, but only for males and females separately. Therefore, I regressed the change in wage inequality for all workers on the change for males for those countries where both statistics are reported. The change in wage inequality for the US is the predicted value from this regression using the US change for males.

Changes in investment growth and labor productivity were calculated using data from the OECD STAN database for Industrial Analysis (OECD 2004). I used data for 18 industries, which are classified in STAN according to the ISIC (Rev. 3) classification. I matched these industries to 1970 US SIC codes, and industry codes in the German 1979 QaC Survey, in order to match the data with information on skill levels. The 18 industries are the following:

Industry	ISIC code (STAN)	1970 SIC code (CPS)	Industry code in the 1979 QaC Survey
Agriculture, Forestry, Fishing	01 – 05	17 – 29	0 – 3
Mining and Quarrying	10 – 14	47 – 58	5 – 8
Food Products, Beverages, Tobacco	15 – 16	268 – 299	54 – 58
Textiles, Leather, Footwear	17 – 19	307 – 327, 388 – 397	45 – 52
Wood and Wood Products	20	107 – 109	40, 42
Pulp, Paper, Printing, Publishing	21 – 22	328 – 339	43, 44, 77
Chemicals, Rubber, Plastic Products	23 – 25	347 – 387	9 – 13
Other Non-metallic Mineral Products	26	119 – 138	14 – 16
Basic Metals, Fabricated Metal Products	27 – 28	139 – 169	17 – 23, 37
Machinery and Equipment	29 – 33	177 – 209, 239 – 258	26, 27, 33 – 36
Transport Equipment	34 – 35	219 – 238	24, 28 – 29, 31, 32
Other Manufacturing, Furniture	36 – 37	118, 259 – 267, 398 – 399	38, 39, 41, 53
Electricity, Gas, Water Supply	40 – 41	467 – 477, 479	4
Construction	45	67 – 78	25, 59 – 61
Wholesale and Retail Trade, Restaurants, Hotels	50 – 55	507 – 699, 749 – 767, 777 – 778, 789 – 797	30, 70, 95 – 97
Transport and Communication	60 – 64	407 – 449, 499, 907	63 – 68
Finance, Insurance, Business Services	65 – 74	707 – 748, 849, 888 – 899,	69, 79 – 83, 85, 86
Personal, Community, Professional Services	75 - 99	478, 769, 779 – 788, 798 – 848, 857 – 887, 917 – 947	71 – 76, 78, 84, 87 - 94

For investment growth, I used the quantity index for gross fixed capital formation (STAN code GFCFK). Investment growth for the 1980s is calculated as the ratio of average investment in 1989, 1990, and 1991 to average investment in 1979, 1980, and 1981. For the 1970s it is the ratio of average investment in 1979, 1980, and 1981 to average investment in 1970, 1971, and 1972. The purpose of the three year averaging is to smooth out some high frequency fluctuations in investment. Data for the 18 industries are available for most countries, except for Australia (9 industries) and France (16 industries). Data for the 1970s are not available for France, Austria, and Finland.

For labor productivity, I used gross output (STAN code PRODK) divided by total employment (STAN code EMPN). The growth rate is calculated as above, using three year averages at the beginning and end of the period. Data are available for Austria, Denmark, Finland, France (12 industries), Italy, Japan (16 industries) Norway, the US (15 industries) and Germany (8 industries); 18 industries are available where nothing else is indicated.

As the skill level in an industry I use the average number of grades completed in the industry for workers in the US. Data are taken from the merged outgoing rotation group samples of the Current Population Surveys for 1979, 1980, and 1981. The sample consists of all workers with labor force status recodes 1 and 2, and industries have been assigned as shown above. Alternatively, I use the average education levels from the German 1979 Qualification and Career Survey.

The coefficients β_c are coefficients from an OLS regression of growth in investment on the average education in the US across the 18 industries. Separate regressions were run for each country to estimate the country specific coefficients.

References

- Acemoglu, D. (2002), "Technical Change, Inequality, and the Labor Market," *Journal of Economic Literature* 40, 7-72.
- Acemoglu, D. (2003), "Cross-Country Inequality Trends," *Economic Journal* 113, F121-49.
- Acemoglu, D. and J.-S. Pischke (1998), "Why Do Firms Train? Theory and Evidence," *Quarterly Journal of Economics* 113, 79-119.
- Acemoglu, D. and J.-S. Pischke (1999a), "Beyond Becker: Training in Imperfect Labor Markets" *Economic Journal* 109, F112-42.
- Acemoglu, D. and J.-S. Pischke (1999b), "The Structure of Wages and Investment in General Training," *Journal of Political Economy* 107, 539-72.
- Acemoglu, D. and J.-S. Pischke (2003), "Minimum Wages and On-the-job Training," *Research in Labor Economics* 22, 159-202.
- Arulampalam, W., A.L. Booth, and M.L. Bryan (2002), "Work-Related Training and the New National Minimum Wage in Britain," *IZA Discussion Paper* No. 595.
- Becker, G. (1964), *Human capital*, The University of Chicago Press, Chicago.
- Blau, F. and L.M. Kahn (2001), "Do Cognitive Test Scores Explain Higher US Wage Inequality?" *National Bureau of Economic Research Working Paper* No. 8210.
- Card, D. and J. DiNardo (2002), "Skill-Biased Technological Change and Rising Wage Inequality: Some Problems and Puzzles," *Journal of Labor Economics* 20, 733-83.
- Card, D., F. Kramarz, and T. Lemieux (1999) "Changes in the Relative Structure of Wages and Employment: A Comparison of the United States, Canada, and France," *Canadian Journal of Economics* 32, 843-77.
- Caselli, Francesco (1999) "Technological Revolutions," *American Economic Review* 89, 78-102.
- Dustmann, C. and U. Schönberg (2004) "Training and Unions," mimeographed, University College London.
- Freeman, R.B. (1995), "Are Your Wages Set in Beijing?" *Journal of Economic Perspectives* 9, 15-32.
- Freeman, R.B. and R. Schettkat (2001), "Skill Compression, Wage Differentials, and Employment: Germany vs the US," *Oxford Economic Papers* 53, 582-603.

- Krueger, A. and J.-S. Pischke (1998), "Observations and Conjectures on the U.S. Employment Miracle," in: *Third Public GAAC Symposium: Labor Markets in the USA and Germany*, German-American Academic Council, Bonn, 99-126.
- Krugman, P. (1994), "Past and Prospective Causes of High Unemployment," in: *Reducing Unemployment: Current Issues and Policy Options*, A Symposium Sponsored by the Federal Reserve Bank of Kansas City, August 25-27, Jackson Hole, Wyoming, 49-80.
- Lemieux, T. (2003), "Composition Effects, Wage Measures, and the Growth in Within-Group Wage Inequality," mimeographed, University of British Columbia.
- Neumark, D. and W. Wascher (2001), "Minimum Wages and Training Revisited," *Journal of Labor Economics* 19, 563-95.
- Nickell, S. (2003) "A Picture of European Unemployment: Success and Failure," *CEP Discussion Paper No. 577*.
- Nickell, S. and B. Bell (1995), "The Collapse in Demand for the Unskilled and Unemployment Across the OECD," *Oxford Review of Economic Policy* 11, 40-62.
- Nickell, S. and B. Bell (1996), "Changes in the Distribution of Wages and Unemployment in OECD Countries," *American Economic Review, Papers and Proceedings* 82, 302-08.
- OECD (1996), "Earnings Inequality, Low Paid Employment and Earnings Mobility," *Employment Outlook 1996*, OECD, Paris, 59-108.
- OECD (2004), *STAN Database*, OECD, Paris.
- Pischke, J.-S. (1998) "Ausbildung und Lohnstruktur: Deutschland und die USA in den 80er Jahren," in B. Gahlen, H. Hesse, and H.J. Ramser, eds., *Verteilungsprobleme der Gegenwart. Diagnose und Therapie*, Schriftenreihe des Wirtschaftswissenschaftlichen Seminars Ottobeuren 27, Verlag Mohr Siebeck, . Tübingen, 95-117.

Figure 1
Training in Labor Markets with Rents and Minimum Wages

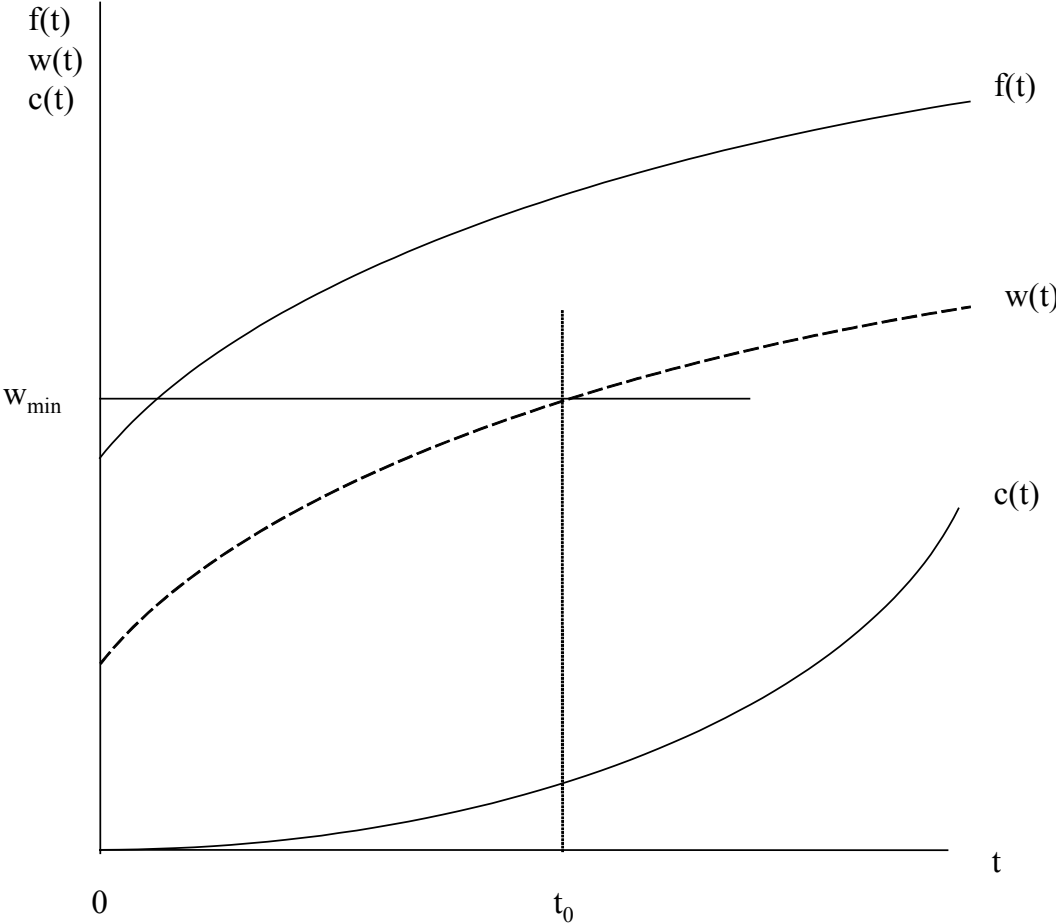


Figure 2
Relative Labor Demand and Supply over the 1980s

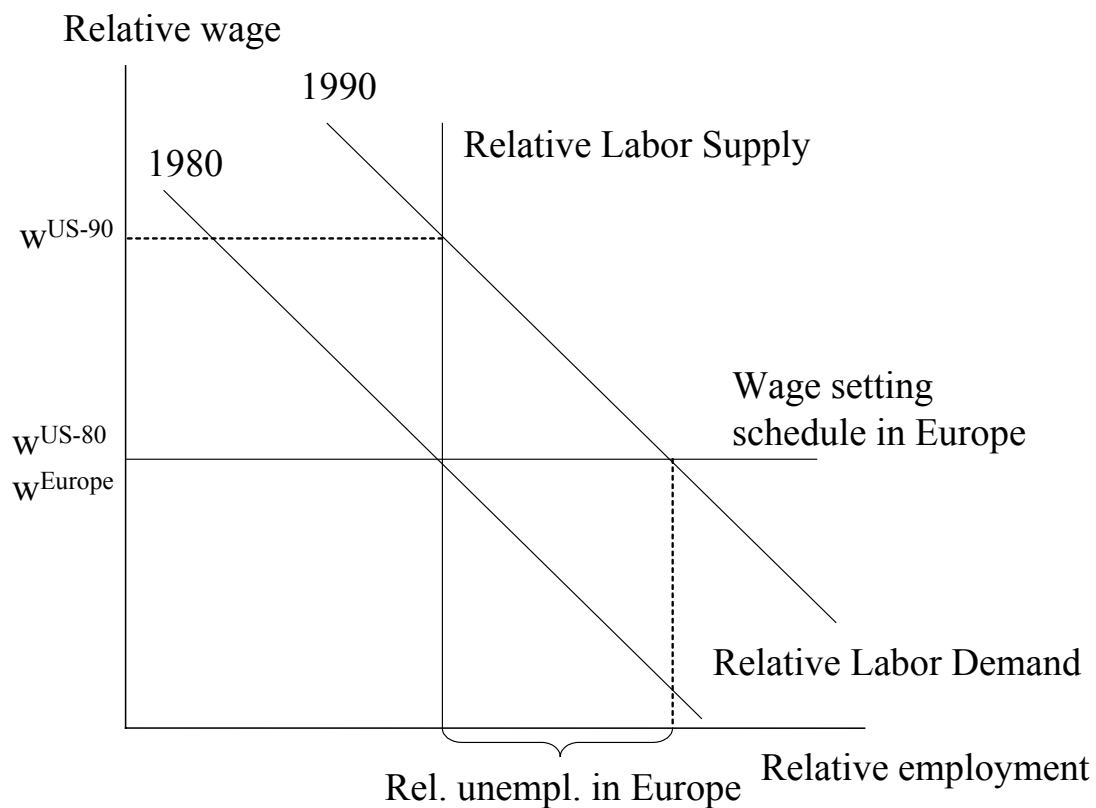


Figure 3
Changes in Wages and Employment Rates
US Men, 1979 - 1991

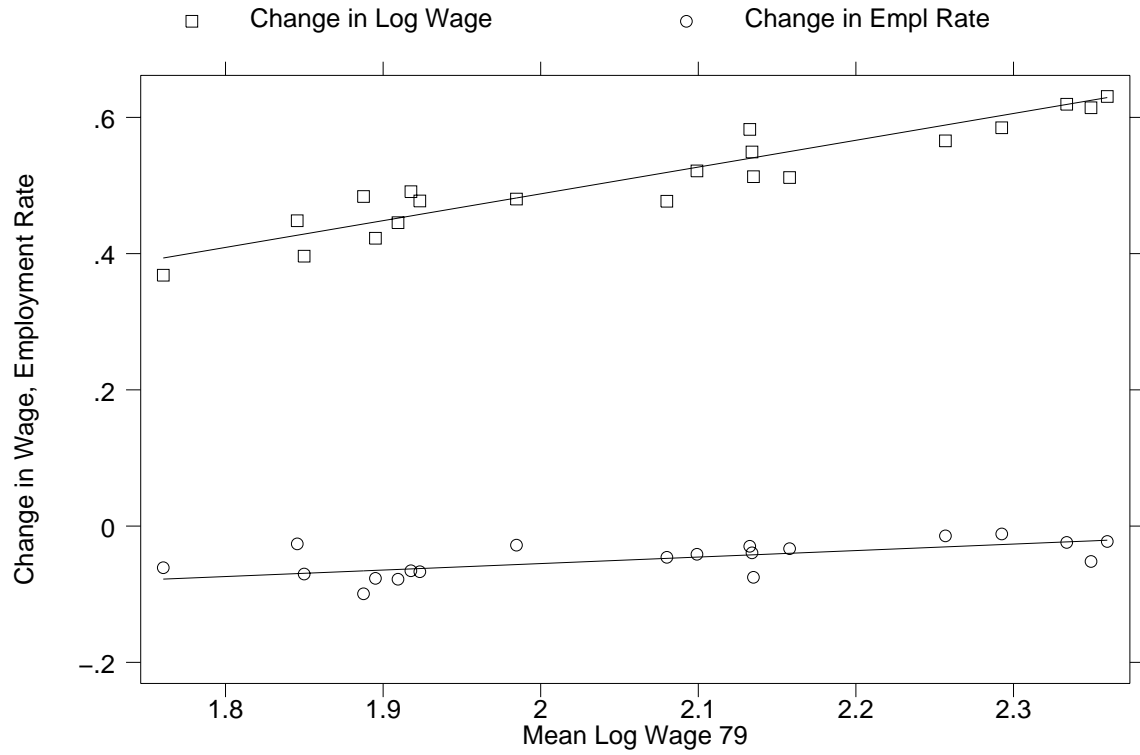


Figure 4
Changes in Wages and Employment Rates
German Men, 1979 - 1991

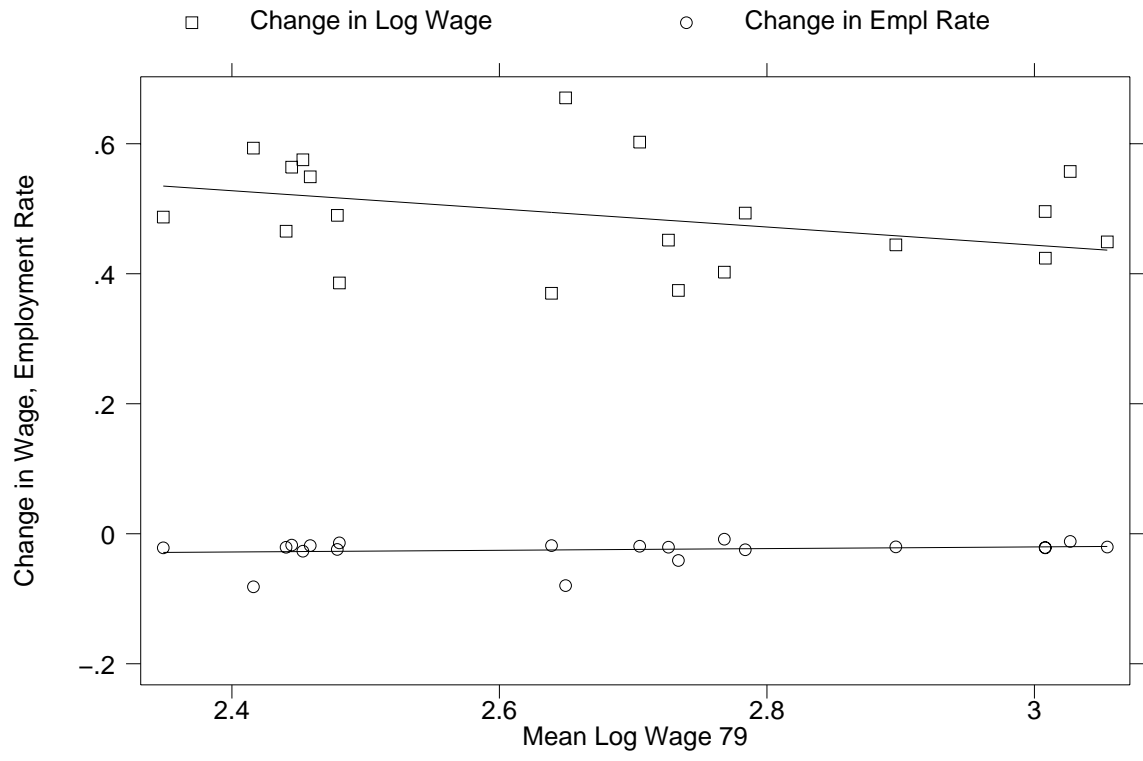


Figure 5
Training with Skill Biased Technical Change

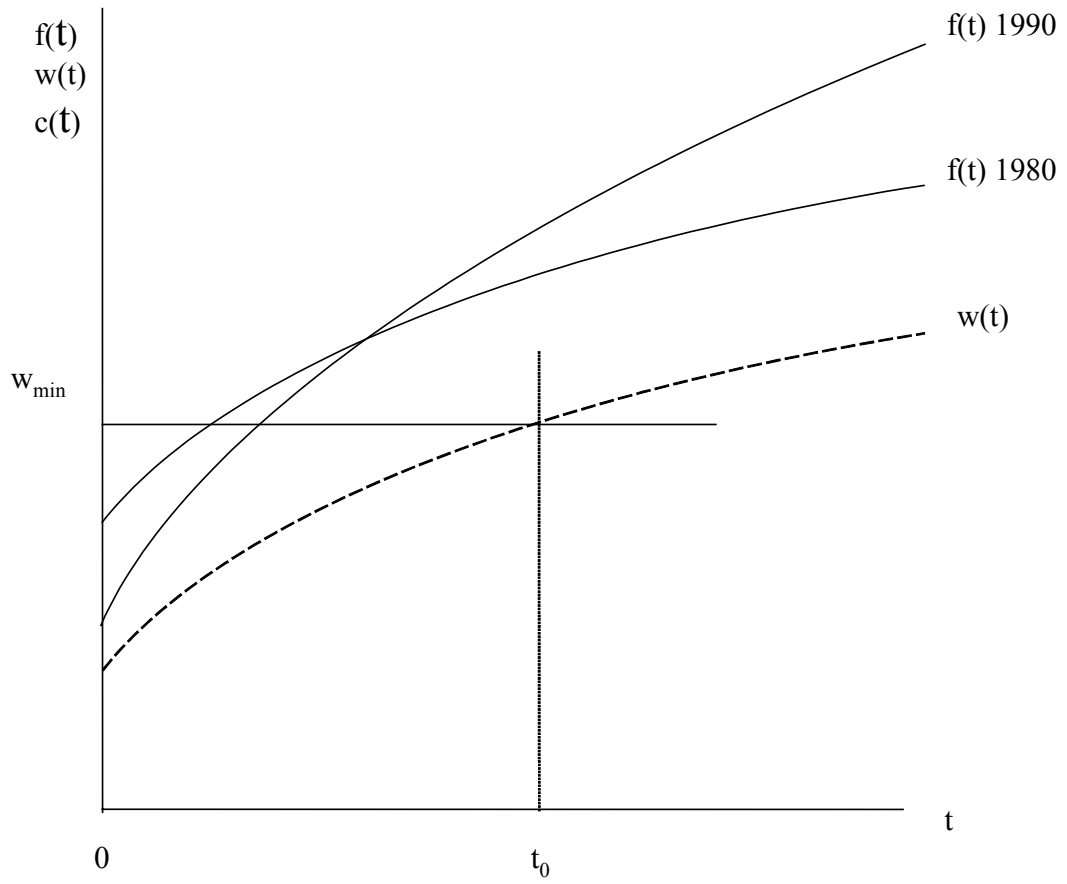


Figure 6
The Association of Investment Growth 1980 - 1990
and Skill versus Changes in Wage Inequality

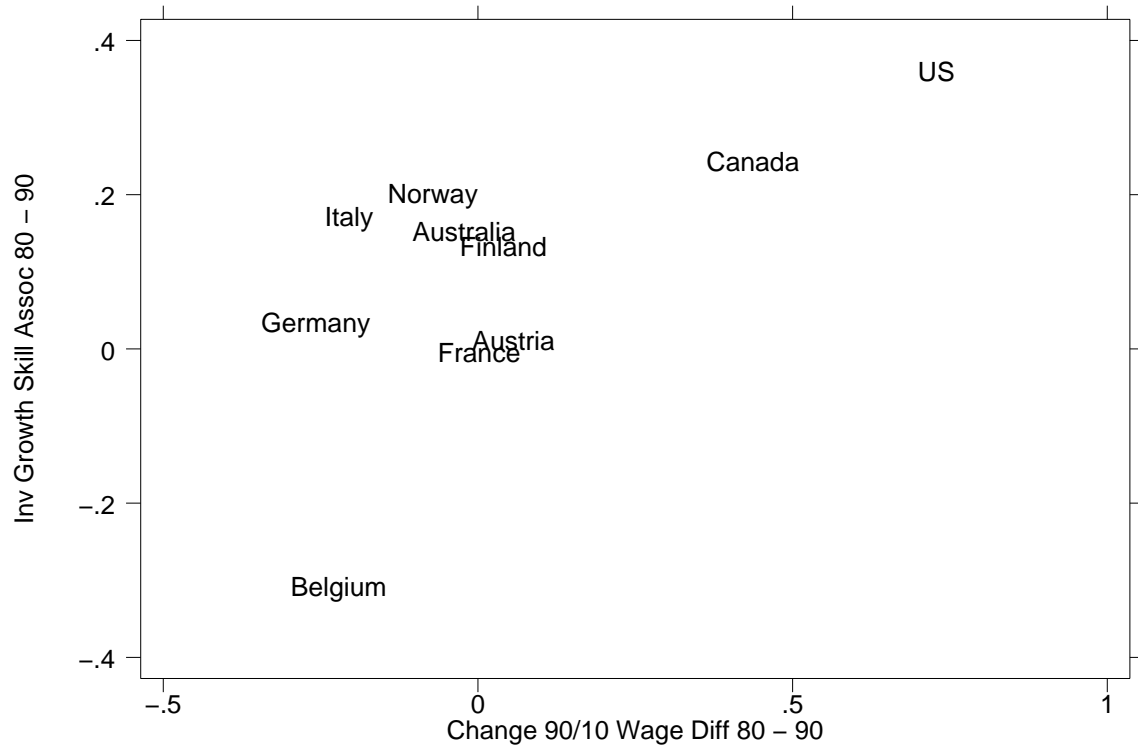


Figure 7
The Association of Investment Growth 1970 - 1980
and Skill versus Changes in Wage Inequality

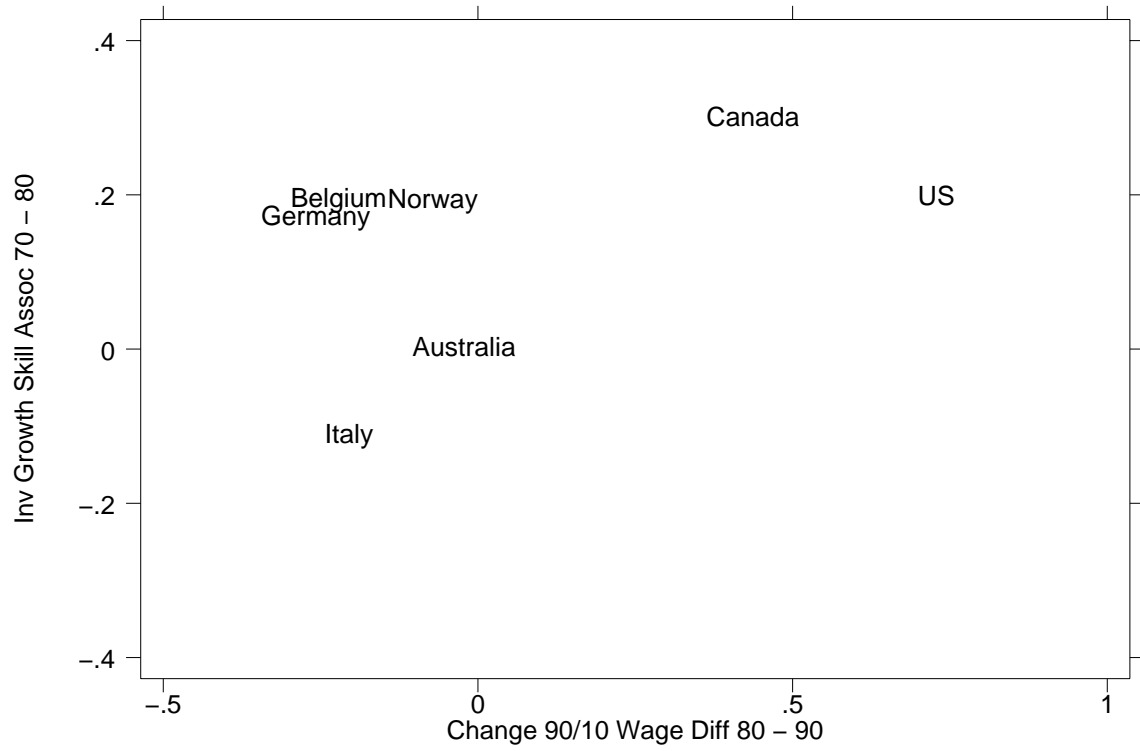


Table 1
Labor Market Trends and Investment in Selected OECD Countries

Country	Change in Wage Inequality 1980-90	Standardized Unemployment Rate (%)				Regression Coefficient of Investment Growth on Skill
		1973-79	1980-87	1988-95	1996-99	
United States	0.73	6.4	7.6	6.1	4.8	0.35
United Kingdom	0.50	4.8	10.5	8.8	6.9	---
Canada	0.44	6.9	9.7	9.5	8.7	0.23
Japan	0.15	1.8	2.5	2.5	3.9	---
Austria	0.06	1.4	3.1	3.6	4.3	-0.00
Finland	0.04	4.1	5.1	9.9	12.2	0.12
Denmark	0.02	4.1	7.0	8.1	5.3	---
France	0.00	4.3	8.9	10.5	11.9	-0.02
Australia	-0.03	4.6	7.7	8.7	7.8	0.14
Norway	-0.07	1.8	2.4	5.2	3.9	0.19
Italy	-0.20	4.5	6.7	8.1	9.9	0.16
Belgium	-0.22	5.8	11.2	8.4	9.2	-0.32
West Germany	-0.26	2.9	6.1	5.6	7.1	0.03

Notes: The changes in wages inequality refers to the change in the ratio of the 90th and 10th percentile of the wage distribution for all workers. These are calculated from the data in table 3.1 in the 1996 OECD Employment Outlook. Where possible changes are calculated for the period 1980 – 90 except for the following: Belgium (1986 – 90), Canada (1981 – 90), West Germany (1983 – 90), and Italy and Norway (1980 – 91). In those cases, the changes were rescaled to correspond to a ten year period. Data on unemployment rates are taken from Nickell (2003) and refer to the OECD standardized unemployment rate, with some adjustments. The regression coefficient of investment growth on skill refers to the coefficients β_c as described in the text for investment growth from 1980 – 90.

Table 2
Incidence of Participation in On-the-job Training (in Percent)

	USA		Germany	
	1983	1991	1979	1991
Training Courses by Firms				
Less Skilled	4.2 (0.3)	3.8 (0.3)	3.6 (0.3)	4.6 (0.4)
Skilled	13.6 (0.2)	14.5 (0.4)	10.6 (0.2)	14.1 (0.3)
Job Related Training Including Informal Training				
Less Skilled	15.4 (0.5)	10.7 (0.4)	---	---
Skilled	26.9 (0.3)	24.0 (0.2)	---	---

Notes: Standard errors are shown in parentheses. The data for the US are calculated from the Training Supplements to the January CPS. The data for Germany are calculated from the BIBB/IAB Qualification and Career Survey. The samples include men and women age 20 to 59, working in the private sector. Less skilled workers in the US are those with less than 12 years of schooling. Less skilled workers in Germany are those with less than 12 years of schooling and no completed apprenticeship or similar vocational qualification. The questions about participation in training differ between the US and German surveys, and incidence should not be compared directly across countries. Training in the US refers to the training in the current job. Training in Germany refers to all job related training within the last 5 years.

Table 3
Regression Results

Independent variable	Dependent Variable					
	Investment Growth 1980-1990		Investment Growth 1970-1980		Productivity Growth 1980-1990	
Avg. education in the industry in the US*change in wage inequality	0.42 (0.11)	0.39 (0.13)	0.22 (0.15)	0.15 (0.12)	0.09 (0.14)	-0.01 (0.08)
Avg. education in the industry in Germany*change in wage inequality	0.68 (0.14)	0.64 (0.19)	0.09 (0.13)	0.05 (0.13)	0.26 (0.27)	0.02 (0.13)
Country effects	✓	✓	✓	✓	✓	✓
Industry effects		✓		✓		✓
Number of countries	10	10	7	7	9	9
Number of observations	168	168	116	116	141	141

Notes: OLS regression models corresponding to equation (2) in the text. Each entry corresponds to a separate regression. Standard errors, which are shown in parentheses, are adjusted for clustering at the country level.

CENTRE FOR ECONOMIC PERFORMANCE
Recent Discussion Papers

- | | | |
|-----|---|---|
| 651 | Anthony J. Venables | Evaluating Urban Transport Improvements: Cost Benefit Analysis in the Presence of Agglomeration and Income Taxation |
| 650 | John Van Reenen | Is There a Market for Work Group Servers? Evaluating Market Level Demand Elasticities Using Micro and Macro Models |
| 649 | Rachel Griffith
Stephen Redding
Helen Simpson | Foreign Ownership and Productivity: New Evidence from the Service Sector and the R&D Lab |
| 648 | Fredrik Andersson
Simon Burgess
Julia I. Lane | Cities, Matching and the Productivity Gains of Agglomeration |
| 647 | Richard B. Freeman
Douglas Kruse
Joseph Blasi | Monitoring Colleagues at Work: Profit-Sharing, Employee Ownership, Broad-Based Stock Options and Workplace Performance in the United States |
| 646 | Alberto Bayo-Moriones
Jose E. Galdon-Sanchez
Maia Güell | Is Seniority-Based Pay Used as a Motivation Device? Evidence from Plant Level Data |
| 645 | Stephen Machin
Olivier Marie | Crime and Benefit Sanctions |
| 644 | Richard B. Freeman | Are European Labor Markets As Awful As All That? |
| 643 | Andrew B. Bernard
Stephen Redding
Peter K. Schott | Comparative Advantage and Heterogeneous Firms |
| 642 | Patricia Rice
Anthony J. Venables | Spatial Determinants of Productivity: Analysis for the Regions of Great Britain |
| 641 | Kwok Tong Soo | Zipf's Law for Cities: A Cross Country Investigation |
| 640 | Alan Manning | We Can Work it Out: the Impact of Technological Change on the Demand for Low Skill Workers |

- | | | |
|-----|--|--|
| 639 | Bianca De Paoli | Monetary Policy and Welfare in a Small Open Economy |
| 638 | Kimberly Ann Elliott
Richard B. Freeman | White Hats or Don Quixotes? Human Rights Vigilantes in the Global Economy |
| 637 | Barbara Petrongolo | Gender Segregation in Employment Contracts |
| 636 | Ann Bartel
Richard B. Freeman
Casey Ichniowski
Morris Kleiner | Can a Work Organization Have an Attitude Problem? The Impact of Workplaces on Employee Attitudes and Economic Outcomes |
| 635 | Paul Gregg
Rosanna Scutella
Jonathan Wadsworth | Reconciling Workless Measures at the Individual and Household Level: Theory and Evidence from the United States, Britain, Germany, Spain and Australia |
| 634 | Stephen Nickell | Employment and Taxes |
| 633 | Fabiano Schivardi
Roberto Torrini | Threshold Effects and Firm Size: the Case of Firing Costs |
| 632 | Paul Gregg
Jonathan Wadsworth | Two Sides to Every Story: Measuring the Polarisation of Work |
| 631 | Jeremy Grant
Thomas Kirchmaier | Corporate Ownership Structure and Performance in Europe |
| 630 | Neal Knight-Turvey
Andrew Neal
Michael A. West
Jeremy Dawson | The Impact of an Innovative Human Resource Function on Firm Performance: the Moderating Role of Financing Strategy |
| 629 | Nicholas Oulton | A Statistical Framework for the Analysis of Productivity and Sustainable Development |
| 628 | Vasileios Gkionakis | Short Job Tenures and Firing Taxes in the Search Theory of Unemployment |
| 627 | L. Rachel Ngai
Christopher A. Pissarides | Balanced Growth With Structural Change |

The Centre for Economic Performance Publications Unit
Tel 020 7955 7673 Fax 020 7955 7595 Email info@cep.lse.ac.uk
Web site <http://cep.lse.ac.uk>