

Discussion Paper No. 12-025

## **Offshoring and Labor Income Risk**

Jan Hogrefe and Yao Yao

**ZEW**

Zentrum für Europäische  
Wirtschaftsforschung GmbH

Centre for European  
Economic Research

Discussion Paper No. 12-025

## **Offshoring and Labor Income Risk**

Jan Hogrefe and Yao Yao

Download this ZEW Discussion Paper from our ftp server:

**<http://ftp.zew.de/pub/zew-docs/dp/dp12025.pdf>**

Die Discussion Papers dienen einer möglichst schnellen Verbreitung von neueren Forschungsarbeiten des ZEW. Die Beiträge liegen in alleiniger Verantwortung der Autoren und stellen nicht notwendigerweise die Meinung des ZEW dar.

---

Discussion Papers are intended to make results of ZEW research promptly available to other economists in order to encourage discussion and suggestions for revisions. The authors are solely responsible for the contents which do not necessarily represent the opinion of the ZEW.

## Non-technical Summary

The paper contributes to the analysis of how offshoring has an impact on labor market outcomes in terms of labor income. Special attention is given to the link between offshoring and income risk - an aspect of income volatility that has scarcely received attention in the previous literature. Permanent income risk is defined as variance of shocks to income that do not fade out over time and are assumed to be not self-insurable. These so-called permanent income risks are clearly welfare relevant as they affect risk-averse individual's decisions on consumption and savings. The aspect of income risk adds to the literature in an important way. While most studies deal with level effects on income, we complement the analysis with a look at volatility. Naturally, for risk-averse individuals, the volatility of the long-term income process is a crucial aspect on top of considerations regarding the level of their earnings. We are also the first to provide an analysis for Germany; a large trading economy with exceptional reliance on international integration. Our analysis proceeds in three steps. First, the unpredictable part of individual income is estimated as the residual term from wage regressions based on individual-level data. Second, values for permanent income risk at the sector level are estimated as the variance of persistent shocks to this unpredictable component. Equipped with income risk estimates for several German manufacturing sectors for the years between 1991 (or 1999) and 2005, we links these to offshoring in a panel framework in step three. Offshoring at the sector level is understood as the amount of intermediate inputs imported from the same industry abroad divided by industry output. We do not distinguish between within-firm versus arm's length transactions as we consider our offshoring variable to approximate the outcome of any make-or-buy decision. We do, however, treat offshoring to non-OECD countries with special attention since this is usually the type of production relocation which stirs up the most anxiety among the public. It is also the type of cost-savings driven offshoring modeled in most of the theoretical literature on the topic.

Our results are quite remarkable: an increase in offshoring in a given sector correlates with a decrease in permanent income risk in that sector. Offshoring to non-OECD countries has a particularly strong impact. We attribute this offshoring related decline in income risk to the fact that, in countries with relatively rigid labor markets, firms tend to offshore volatile production intensive parts of their undertakings which leaves the remaining tasks less volatile on average. Overall, a decrease in income risk provides a channel through which offshoring can be welfare enhancing. Of course, this only holds true if wage and employment levels are not negatively affected by offshoring. Given the literature's recent results of no large influence of offshoring on absolute employment and wage levels in OECD economies, we are indeed leaning towards an optimistic conclusion.

## Das Wichtigste in Kürze

Dieses Diskussionspapier geht der Frage nach, wie sich Auslagerungsprozesse von Produktionsaktivitäten, so-genanntes Offshoring, auf den deutschen Arbeitsmarkt auswirken. Insbesondere wird der Zusammenhang zwischen Offshoring und Einkommensrisiko behandelt - ein Aspekt der bisher in der Literatur kaum Beachtung gefunden hat. Einkommensrisiko bezeichnet hierbei Schocks auf das Einkommen, welche nicht nach kurzer Zeit auslaufen und daher nicht durch Sparen oder Entsparen selbstständig "versicherbar" sind. Dieses sogenannte permanente Einkommensrisiko ist eindeutig wohlfahrtsrelevant, da hiervon die langfristigen Spar- und Konsumententscheidungen risikoaverser Individuen betroffen sind. Durch die Analyse des Einkommensrisikos tragen wir zudem dadurch zum Fortschritt der Forschungsliteratur bei, dass wir nicht allein Niveaueffekte untersuchen. Risikoaverse Individuen benötigen bezüglich wohlfahrtsrelevanter Entscheidungen immer auch Informationen über die Volatilität des Einkommens.

Unsere Analyse beinhaltet drei Schritte. Zunächst wird der unvorhersehbare Teil des individuellen Einkommens als der Residualterm einer Lohngleichung geschätzt. Dieser dient anschließend als Grundlage für die Schätzung des permanenten Einkommensrisikos. Die resultierenden Werte für verschiedene Sektoren des verarbeitenden Gewerbes in Deutschland zwischen 1991 (bzw. 1999) und 2005 werden anschließend in einer Panelanalyse mit Daten zur sektoralen Intensität des Offshoring in Verbindung gesetzt. Die Intensität des Offshoring ist hierbei definiert als importierte Zwischenprodukte eines Sektors welche dem gleichen Sektor im Ausland entstammen, geteilt durch den Gesamtoutput des Sektors. Wir unterscheiden nicht zwischen Transaktionen innerhalb einer Firma als rechtlicher Einheit und unabhängigen Zulieferern. Alle Entscheidungen, einen Teil der Produktion nicht im Inland auszuführen, werden somit durch unser Maß angenähert. Allerdings rechnen wir Offshoring in nicht-OECD Ländern eine besondere Bedeutung zu, da diese an Kostenersparnis orientierte Form der Verlagerung die meiste Aufmerksamkeit in der öffentlichen Diskussion, sowie der theoretischen Modellierung erfährt.

Als Ergebnisse dieser Studie ergeben sich die folgenden Schlussfolgerungen. Ein Anstieg der Offshoringintensität eines Sektors senkt das durchschnittliche permanente Einkommensrisiko in diesem Sektor, insbesondere wenn in nicht-OECD Länder ausgelagert wird. Ein Grund für ein solches Ergebnis könnte sein, dass Firmen die volatileren Produktionsstufen ins Ausland verlagern und somit die weniger schwankungsanfälligen Tätigkeiten im Inland verbleiben. Eine solche Tendenz kann sich z.B. daraus ergeben, dass Deutschland auf Grund eines relativ rigiden Arbeitsmarkts einen komparativen Vorteil in weniger volatilen Teilen der Wertschöpfungskette hat. Sind gleichzeitig keine großen Effekte durch Offshoring auf das Niveau der Beschäftigung und der Löhne festzustellen, kann Offshoring somit wohlfahrtssteigernde Effekte haben.

# Offshoring and Labor Income Risk <sup>\*</sup>

04/2012

**Jan Hogrefe**

ZEW Mannheim

**Yao Yao**

Mannheim University

## **Abstract**

This paper analyzes the impact increased offshoring has on labor income risk. It is therefore distinct from a large number of studies explaining the level effects of globalization on the labor market in that it takes a look at effects on second moments, i.e. the variance of incomes. It provides an assessment that directly connects labor income risk and offshoring trends at the sector level. Importantly, we distinguish between transitory and permanent shocks to individual income. Permanent income risk is defined as variance of shocks to income that do not fade out over time and are assumed to be not self-insurable. It thus has a particular relevance for individual welfare. Our findings suggest that offshoring tends to lower permanent income risk. This effect is particularly strong for offshoring to low-income destinations. Hence, there could be potential welfare gains when domestic firms increasingly offshore production to foreign countries.

**Keywords:** trade, offshoring, wages, labor income risk

**JEL Classification Numbers:** F16, F23, E24

---

<sup>\*</sup>For valuable comments and suggestions, the authors would like to thank Sebastian Benz, Gabriel Felbermayr, Marcus Kappler, Tom Krebs, Wilhelm Kohler, and Atilim Seymen as well as participants at the ETSG 2011, DMM 2011, SMYE 2011 conferences and seminars and workshops in Munich, Goettingen, and Tuebingen. All potential errors are our own. *Corresponding author:* Jan Hogrefe, Centre for European Economic Research (ZEW) Mannheim. Address: L7,1 68161 Mannheim, Germany. Email: hogrefe[at]zew.de. Phone: +49 (0)621 1235 348

# 1 Introduction

Globalization is often perceived as creating a more volatile working environment on the labor market. In particular, trends such as the relocation of parts of production abroad (offshoring) induce fears of job loss and higher fluctuations in individual income. While the long-run *level* effects of offshoring have been documented by a large literature (see e.g. Feenstra (2010) and Geishecker and Görg (2008)), a lot less academic attention has been paid to the analysis of its second moment effects, i.e. effects on the *variance* of incomes. Our paper thus aims at further completing the picture of how offshoring has an impact on characteristics of labor income by estimating the relationship based on data from German manufacturing. To the best of our knowledge, our paper is the first one to put the link between offshoring and income risk at the heart of an empirical analysis.

Income risk is defined as the variance of changes in the unexplained component of individual income. As such, it describes changes in income that are not a result of observable and predictable characteristics like age or education. It is unexpected variation from an ex-ante perspective. Crucially, we distinguish between transitory and permanent risks to income. Transitory shocks to income are more likely to be smoothed out by self-insurance mechanisms such as saving and borrowing. However, this does not hold for permanent shocks, i.e. shocks that permanently shift an individual's income trajectory. Following the literature, we assume permanent income risk to be uninsurable from an individual perspective. Then, unexpected permanent variation in income affects the present value of lifetime earnings, which has consequences for the consumption and savings decisions (Aiyagari (1994)). The literature has pointed out the welfare relevance of such changes in permanent income risk. Consider for example an increase in income risk. Welfare, defined as the equivalent variation in lifetime consumption, is usually expressed as the amount of lifetime consumption risk averse individuals would be willing to give up to compensate for the increase in income risk (Krebs et al. (2010)). It is thus the permanent component of income shocks we are interested in. Linking offshoring to changes in the variance of permanent income shocks yields a discussion of the effect of offshoring on labor income which allows for considerations on welfare consequences.

Most of the related literature on income risk has focused on explaining the welfare effect of exogenously given changes in income risk. For the analysis in this paper, we shift the focus towards factors determining trends in income risk. That is, we aim at unveiling a potential *reason* for changes in income risk. Taking the effects on welfare as reasonably established by the literature, it seems to us that identifying the sources of movements in income risk is a viable contribution to the literature. In this paper we present offshoring as one such candidate explanation.

From the outset, it is not clear whether offshoring increases or decreases income risk - especially with respect to the permanent component. On the one hand, there is empirical evidence at the sector-level that offshoring tends to raise labor demand elasticities which could lead to higher income risk (e.g. Senses (2010)). On the other hand, this evidence is in part contradicted at finer levels of aggregation. Becker and Muendler (2008) find offshoring to actually lower separation rates in employment at the firm-level and Buch and Lipponer (2010) directly cast doubt on the claim that offshoring is responsible for changes in labor demand elasticities within multinational firms. It is important to note, however, that most studies within the rather inconclusive empirical literature are only indirectly related to the concept of income risk, and its permanent component in particular. As mentioned above, our analysis specifically tries to address a measure of "insecurity" that has clear and well-documented welfare implications - a characteristic generally attributed to the permanent component of income risk.

In addition to the mixed empirical results, theory recently suggested offshoring to be much less of a specter to workers than what is reflected in public anxiety and job loss fears. For example, Bergin et al. (2009) show that offshoring has the potential to exert a dampening effect on economic volatility in the offshoring country if demand shocks are buffered by excess production activity in offshore plants. In other words, fluctuations are "exported" and firms face a less volatile domestic economic environment; and potentially their workers do as well.<sup>1</sup> It is also possible that offshoring induces what may be called a "composition effect". If offshoring is understood as trade in tasks, as in Grossman and Rossi-Hansberg (2008), and the tasks as such differ in their specific income volatilities, the relocation of certain tasks abroad might lead to aggregate changes in sector-level income risk. If the offshored tasks are at the same time more volatile with respect to income, the average income risk of the tasks remaining onshore falls. One could think of this effect as arising from firms effectively insuring themselves against fluctuations in economic activity. If institutional rigidities in the home market make adjustment costly, firms would be expected to relocate the activities most affected in places where adjustment is less costly. Such considerations seem particularly plausible in light of the European Union's enlargement to the East and Germany's location close to the new EU member states.<sup>2</sup>

Overall, it seems as if a study comprehensively linking offshoring to the permanent component of income risk – a measure that has been shown to trigger important welfare

---

<sup>1</sup>Yet, the opposite holds true for the receiving country. Volatility abroad (e.g. in Mexico for the case of US offshoring) is amplified.

<sup>2</sup>Note that this does not necessarily lead to an aggregate employment loss with less volatile yet lower overall employment at home since offshoring also triggers productivity effects possibly leading to net job creation (Kohler and Wrona (2010)).

effects – is missing in the literature so far. This seems somewhat surprising given the high level of academic and public interest in the topic and its high and rising importance for open economies worldwide. In the present study we suggest a piece of evidence further completing the understanding of how globalization interacts with labor markets.

The particular focus on offshoring also sets this paper apart from the recent literature studying income effects of other forms of globalization such as import competition and tariff reductions. Aside from the vast amount of studies dealing with level effects on wages and employment, we know of two other studies taking up the notion of permanent income risk. Krebs et al. (2010) analyze how tariff reductions and the ensuing integration of the Mexican economy into the world market (in particular the North American part of it) affected income risk. They show income risk to increase as a response to trade liberalization, inducing the emergence of negative welfare effects. Yet, the Mexican economy may be considered a rather special case, in particular with regard to its proximity to the US and the existence of the "maquiladora" sector near the northern border.<sup>3</sup> Krishna and Senses (2009) set out to find the roots of income risk for the US labor market. Their prime candidate is import competition, which they show to raise the permanent component of income risk.<sup>4</sup> Yet, those papers remain fairly general in terms of how trade openness or a higher share of imported goods in domestic consumption affect income risk. Also, we stress that offshoring is not the same as final goods trade. It allows for a task-level arbitrage opening up the possibility of a composition effect as described above.

Our analysis proceeds in several steps. First, we derive and estimate measures of income risk which we subsequently link to offshoring. We provide two variants of the analysis. We begin our effort by taking a long-run perspective and estimate the permanent component of income risk from the German Socio-Economic Panel (GSOEP). Here, income risk is estimated at the sector level from individual income data as the average variance of changes in the unexplained component of individual income. The latter is retrieved from standard Mincerian wage regressions. Based on this data, we uncover average income risk over five-year intervals which we link to average offshoring intensities at the sector level in the same time dimension. We therefore aim at answering whether a structural change in the economy, with ever more production stages being performed abroad, leads to domestically higher or lower income risk. Subsequently, we turn to a yearly analysis. At this stage we use individual-level data from official German social

---

<sup>3</sup>In fact, this "maquiladora" sector has been shown in Bergin et al. (2009) to have a particularly high volatility due to its role in the production sharing with the US economy.

<sup>4</sup>As a robustness check, which consists of including a host of further variables, these authors also employ an offshoring variable which shows a negative coefficient in their estimations. However, this variable differs in its construction from the ones used here and its impact is not further discussed by the authors.



security records, allowing us to link offshoring and income risk at a higher frequency. Both approaches rely on fixed-effects panel methods, helping us to answer the question of whether an increase in offshoring over time increases or decreases income risk. The offshoring measures are calculated at the sector level using detailed yearly import matrices from input-output tables in combination with output and trade data. They represent the output-share of intermediate goods imported by some sector that originate in the same sector abroad - a well established concept in the literature used to approximate the sector-level outcome of multiple make-or-buy decisions at the level of the firm (Feenstra and Hanson (1996)).

Our findings suggest that an increase in offshoring leads to a *decrease* in income risk. The observed rise in the overall offshoring intensity implies, on average, a 11% to 28% fall in permanent income risk compared to its mean value. For offshoring to non-OECD countries, the corresponding numbers for the observed increase reach up to around 30%. Looking at offshoring as a particular type of international trade, we thus find the *opposite* effect in comparison with other studies relating globalization to permanent income risk.

The paper is structured as follows. The next section details the approach for estimating income risk, presents the data we use, and gives further insight into measuring the offshoring intensity at the sector-level. In sections 3 and 4 we describe in detail the econometric specification and provide results on how income risk is affected by offshoring, respectively. A concluding section features some important considerations on welfare effects.

## 2 Estimation and Calculation of Variables

### 2.1 Estimating Labor Income Risk

The approach taken in this paper involves a three-stage procedure to first estimate the transitory and permanent components of individual income risk (stage one and two), and then relating these to carefully constructed offshoring indices at the sector level (stage three). The goal of this section is to motivate our measure of income risk and to derive the corresponding estimation procedure. We follow the bulk of the literature and define income risk as the unpredictability of individual income while referring to this variability from an ex-ante perspective (Carroll and Samwick (1997); Meghir and Pistaferri (2004), among others). As such, income risk accompanies people whenever their future income is stochastic. In this sense, income risk is conceptualized as a deviation of the future income stream from its expectation, and is estimated as the variance of changes in the unexpected component of individual income.

In our paper, as in most of the related literature, the estimated income risk has two components: transitory income risk and permanent income risk. This distinction is important since the two components have vastly different welfare effects. Transitory risk refers to the variance of stochastic income changes without persistence. Therefore, it could be effectively "self-insured" by individuals through saving and borrowing. Such unexpected transitory variation could be introduced by windfall labor income or changes in hours worked, which do not persist until the end of an individual's working life. Moreover, in the estimation transitory income risk measurement error in data is also usually captured. Thus, there are no reasons for individuals to change their consumption and savings pattern, and therefore there are hardly any welfare effects (Levine and Zame (2002)). For the permanent component of income shocks, however, a different picture emerges. Permanent income risk has profound effects on the consumption-savings decision of individuals in environments with imperfect insurance possibilities. Permanent income shocks reflect the stochastic trend of income. These shocks have persistent power over the remaining working period of individuals. This affects the present value of lifetime earnings and thus individuals consume out a certain amount of permanent shocks. Therefore, and in contrast to transitory risk, permanent income risk has a direct effect on individual welfare (Constantinides and Duffie (1996), and Krebs (2003)). Permanent shocks are observed as permanent events during workers' employment - for example, promotion beyond expectation or changes in employment resulting in a different matching quality of an individual's abilities and the job's requirements. Given its welfare relevance, we thus focus our analysis on the connection between offshoring and permanent labor income risk. Following related studies, we disregard the transitory component.<sup>5</sup>

The procedure for estimating the components of income risk starts with the identification of the unexplained component of individual income. This component is retrieved as the residual from standard Mincerian wage regressions of the following form:

$$y_{it} = \alpha_{jt} + \beta_t X_{ijt} + u_{ijt} \quad (1)$$

Note that the regressions are run year-by-year and include fixed-effects for sectors  $j$ . The control vector  $X_{ijt}$  includes the commonly used wage determinants such as age, education, marital status, nationality and firm-size.<sup>6</sup> Notice that the estimation allows for changes in the returns to observable characteristics. An increase in the skill premium,

---

<sup>5</sup>As stated before, another reason for ignoring transitory income risk is that this measure will pick up all measurement error in the estimation procedure outlined below (also see Krebs et al. (2010)).

<sup>6</sup>In the GSOEP data, due to the lower number of observations at our disposal, we include both male and female individuals and add a corresponding dummy variable to the control vector. In the BA data, we focus on male individuals since they are usually assumed to be the household head with their income being less affected by intra-household labor substitution.

for instance, is not regarded as contributing to income risk. The regressions are run on a restricted sample which includes individuals fully employed in manufacturing industries in West Germany.  $y_{it}$  is the natural logarithm of our income variable for individual  $i$  in year  $t$ , specified in more detail in the database descriptions below. The above model implies that individuals derive their expectations about the future income from a projection based upon their observable and predictable characteristics. Thus,  $u_{ijt}$  is the unexpected and stochastic component of individual earnings, which is idiosyncratic and unpredictable to them. We show exemplary results from this first stage regression in the appendix.

For the estimation of income risk and its components we make the following assumptions. Suppose  $u_{ijt}$  has two components: a permanent one  $\omega_{ijt}$  and a transitory one  $\epsilon_{ijt}$ . Furthermore, assume  $\omega_{it}$  to follow a random walk process.<sup>7</sup>

$$u_{ijt} = \omega_{ijt} + \epsilon_{ijt} \tag{2}$$

$$\omega_{ijt} = \omega_{ijt-1} + \eta_{ijt} \tag{3}$$

In equation (2),  $\epsilon_{ijt}$  is white noise, which has only a temporary effect on labor income and would vanish in the next time period.  $\eta_{ijt}$ , however, has persistence because  $\omega_{ijt}$  follows a random walk process.

Based on this assumed structure of the unexplained part of income, we can single out the permanent component of income risk. Recall that we are interested in the variance of the changes in this unexplained part of income. There are two different strategies usually employed in the literature. They differ in their assumptions of whether income risk can be assumed to be time-independent. As can be seen from the following subsections, assuming time-independence (at least within sub-periods) substantially simplifies the estimation. We will nevertheless calculate both time-invariant and year-specific income risk. However, we will have to use different data sources in the two cases.

---

<sup>7</sup>The random walk assumption is not the only possible structure underlying the income process. For instance, other papers have suggested including a third (MA(1)) component. Yet, as Krebs and Yao (2009) show, the permanent component of income risk is hardly affected by different assumptions on the income process. We therefore stick to the random walk assumption.

### 2.1.1 Time-invariant Income Risks

In this subsection, we assume that shocks are time-invariant, that is,  $\epsilon_{it}$  and  $\eta_{it}$  in each period are white noise and i.i.d distributed.<sup>8</sup>

$$\epsilon_{it} \sim N(0, \sigma_\epsilon^2) \quad (4)$$

$$\eta_{it} \sim N(0, \sigma_\eta^2) \quad (5)$$

$\epsilon_{it}$  and  $\eta_{it}$  are independent for all leads and lags, that is,  $cov(\epsilon_{it}, \epsilon_{is}) = 0, \forall t \neq s, cov(\eta_{it}, \eta_{is}) = 0, \forall t \neq s, cov(\epsilon_{it}, \eta_{is}) = 0, \forall t, s$ . For the changes in the unexplained income over time, we can generally write the n-year difference of  $u_{ijt}$  as

$$\Delta_n u_{it} = u_{it+n} - u_{it} = \eta_{it+1} + \dots + \eta_{it+n} + \epsilon_{it+n} - \epsilon_{it} \quad (6)$$

Hence, assuming  $\eta_i = \eta_{it}$  the variance of  $\Delta_n u_{it}$  is simply given by:

$$V[\Delta_n u_{it}] = n\sigma_\eta^2 + 2\sigma_\epsilon^2 \quad (7)$$

where  $\sigma_\epsilon^2$  and  $\sigma_\eta^2$  are the variances of the transitory and permanent shocks to income, respectively. Note that  $2\sigma_\epsilon^2$  is a constant. Thus, the simplifying assumption of time-invariant income risk allows us to retrieve  $\hat{\sigma}_\eta^2$  from a simple linear regression.<sup>9</sup> This is the approach taken by the vast majority of the literature (see for example Gottschalk and Moffitt (1994); Carroll and Samwick (1997); Krishna and Senses (2009)). Note that with a sufficiently large  $T$ , it is possible to still retrieve quasi time-varying coefficients for income risk if time-independence is assumed to hold within but not between subperiods  $m$ . This is the approach we follow for part of the analysis in this paper where we assume income risk to be constant within 5 year sub-periods.

### 2.1.2 Time-specific Income Risks

The above assumption of time-independence may seem to be a strong one, and the quick-fix solution of looking at changes in permanent income risk between subperiods somewhat arbitrarily rests on the choice of the length of  $m$ . Shocks to permanent labor income in reality could differ across time periods due to, e.g. macroeconomic factors such as business cycle movements or trade related influences.<sup>10</sup> In fact, this is exactly what our

---

<sup>8</sup>In this section we drop the subscript  $j$  to improve on the exposition. Naturally, all income risk measures estimated and used in the analysis in further sections are to be understood as sector-level variables.

<sup>9</sup>In more detail, we minimize  $\sum_t \sum_1^{T-t} [V[\Delta_n u_{it}] - (n\sigma_\eta^2 + 2\sigma_\epsilon^2)]^2$  by using OLS methods.

<sup>10</sup>Storesletten et al. (2004) argue that the conditional variance of these permanent income shocks is counter-cyclical, increasing during contractions and decreasing during expansions. Krebs et al. (2010) find that trade policy has a significant effect on income risk.

paper is aiming to identify: How *changes* in permanent income risk can be explained. We therefore briefly describe the adjustments needed for estimation of yearly values of permanent income risk.

Dropping the assumption of time-constancy of income risk,  $\epsilon_{it}$  and  $\eta_{it}$  are no more i.i.d normally distributed in each period, but dependent on time, that is,

$$\epsilon_{it} \sim N(0, \sigma_{\epsilon t}^2) \quad (8)$$

$$\eta_{it} \sim N(0, \sigma_{\eta t}^2) \quad (9)$$

Still,  $\epsilon_{it}$  and  $\eta_{it}$  are independent with each other at all leads and lags.  $cov(\epsilon_{it}, \epsilon_{is}) = 0, \forall t \neq s, cov(\eta_{it}, \eta_{is}) = 0, \forall t \neq s, cov(\eta_{it}, \epsilon_{is}) = 0, \forall t, s$ .

In contrast to (7) above, the variance of changes in the unexplained component of individual income between period  $t$  and  $t + n$  now is given by:

$$V[\Delta_n u_{it+n}] = \sigma_{\eta, t+1}^2 + \dots + \sigma_{\eta, t+n}^2 + \sigma_{\epsilon, t}^2 + \sigma_{\epsilon, t+n}^2. \quad (10)$$

The estimation furthermore relies on additional moment conditions for the transitory component. In particular, it is assumed that this component of income risk is identical for the first and last two periods. Naturally, this also restricts the permanent component to being the same for those periods. According to Krebs et al. (2010), the permanent component of income risk can be estimated from (10) using GMM methods. In particular, given the relatively small sample size of our available data, we use the EWMD (equally weighted minimum distance) estimator.

## 2.2 Data and Implementation

In order to implement the above estimation strategy, our data has to meet certain requirements. On the one hand, we need a sufficient amount of variation within each sector for each year. On the other hand, it is desirable to have a long time dimension in order to track the relationship of offshoring and income risk for several years. We have two different datasets at our disposal, each of which has its particular advantages. The first dataset is a long-run survey, the so-called German Socio-Economic panel (GSOEP).<sup>11</sup> The second is a sample from official social security records from the German Employment Agency ("BA-Employmentpanel").<sup>12</sup>

---

<sup>11</sup>The GSOEP data are provided by the DIW Institute in Berlin. Information on variables and data access can be gained at [http://www.diw.de/en/diw\\_02.c.222724.en/soepinfo.html](http://www.diw.de/en/diw_02.c.222724.en/soepinfo.html)

<sup>12</sup>This study uses the factually anonymous BA-Employment Panel (Years 1998 - 2007). Data access was provided via a Scientific Use File supplied by the Research Data Centre (FDZ) of the German Federal Employment Agency (BA) at the Institute for Employment Research (IAB). For detailed information on the database, see Schmucker and Seth (2009).

In both cases we use information on income for individuals that stay within the same sector over time.<sup>13</sup> We thus predominantly observe income variation for people who remain employed, yet face income changes due to wage changes and changes in other payments such as bonuses. Yet, we do not exclude individuals that lose their job and are re-employed in the same industry, irrespective of how long this unemployment spell is.<sup>14</sup> In fact, temporary job loss is likely an important source of variation in income as job transition is often accompanied by a loss of occupation or employer-specific human capital leading to persistent changes in income. We do not, however, include variation based on individuals switching between sectors or out of manufacturing in general.<sup>15</sup> We admit that switching sectors can be a source of income risk, yet one that is difficult to link to offshoring in our framework. In particular, it is not clear which industry-level offshoring intensity to consider for such individuals.<sup>16</sup> Even within these limits, we will show that there is considerable variation in individual income and that a substantial part of this is reflected in permanent income risk.

### 2.2.1 German Socio-Economic Panel Data

While the GSOEP data covers individuals since the mid-1980s and therefore allows for a longer-run view on income risk, it has insufficient observations by year and industry to fully estimate time-varying income risk. We therefore divide this data into 5-year sub-periods and estimate the permanent component of income risk based on (7) within each one of them. Thus, we assume that the transitory and permanent components can change between periods, but are constant within each 5-year period. That is,  $\epsilon_{it} \sim N(0, \sigma_{\epsilon,m}^2)$ ,  $\eta_{it} \sim N(0, \sigma_{\eta,m}^2)$ . The wage regressions are run on a sample restricted to west German residents aged 18 to 65 that are fully employed in one of the 22 two-digit NACE manufacturing industries. The income variable in this case is the hourly wage rate, for which we set a threshold at the minimum social security transfer payment in order to exclude individuals who report implausibly low labor income. We also adjust for oversampling of high income individuals.

---

<sup>13</sup>About 87.25% of observed individuals stay within the same 2-digit sector.

<sup>14</sup>Only if an individual never returns into employment until the end of our sample it is not included after once losing the job.

<sup>15</sup>If an individual is employed in several sectors over the sample period, we treat it as if it were two different individuals. That is, we use variation occurring during employment within a sector, but not between sectors.

<sup>16</sup>Krishna and Senses (2009) estimate income risk to be higher for individuals experiencing a transition from one sector to another when compared to individuals staying in one sector. We thus regard our estimations of income risk as representing a lower bound. On the difficulty of including this variation in a study exploring the causes for changes in income risk, also see Krebs et al. (2010)).

### 2.2.2 BA-Employment-Panel Data

In contrast to the GSOEP, the BA-Panel is rather short with its 10 year time period. Yet, it has significantly more observations per industry and year. Thus, it allows us to estimate yearly income risk. It represents a 2 percent random sample drawn from official German employment records based on social security contributions for the years from 1998 to 2007. Income information in this case is monthly income and includes non-wage payments such as bonuses to the employees. Again, we restrict the panel to full-time employed, working age, west German residents. This still leaves us with a total of more than 770,000 individual observations. We then proceed by applying the estimation approach for time-varying income risk. Note that our focus on permanent income implies that we only obtain estimates for the years up to 2005, since persistence of shocks is hardly observed when approaching the last year of sample. Furthermore our estimation approach technically relies on the additional assumption that in the first two periods, income risk values are identical. This leaves us with observations for the years 1999 to 2005.

A common concern about such official German employment records is that the accompanying income information is censored at the legal threshold for social security contributions. This is the case in the present data as well. It is of potential concern that some income variation might be precluded from the analysis. Note that even an approach as ours, which relies on variation over time between sectors when linking offshoring and income risk, is affected since the share of individuals at the income threshold is non-constant. On the other hand, the problem is less severe in manufacturing and in particular among low-skilled workers. These individuals simply rarely reach the threshold income. Yet, we tackle the problem, as most studies in the literature (e.g. Dustmann et al. (2009)), by imputing the censored part of the wage distribution. We follow Gartner (2005) and use an approach based on truncated regressions and draws from a log-normal distribution.<sup>17</sup>

Finally, the BA-panel data is quarterly in its original style. Yet, most of the income information is based on one entry per year only (so called "Jahresmeldung"). Thus, only yearly information can be calculated. We do so by using time-weighted averages over all reported monthly income data points as long as the individual does not change the sector of employment within the year. In order to check if this latter feature is too restrictive, we also provide estimates based on just using information from a single wave per year; the June wave in our case. These alternative estimates do not much affect our results and are shown in the appendix.

---

<sup>17</sup>Note that censoring of the wage variable plays no role in the GSOEP as this is survey data.

## 2.3 Income Risk: Results

Table 1 shows estimates of the permanent component of income risk based on the GSOEP data.<sup>18</sup> It can be seen that the estimates vary quite a bit across sectors, both with respect to levels and the change from the first to the last period.<sup>19</sup> The estimates imply an employment weighted average standard deviation of 0.077. That implies an average (permanent) yearly change of 8% of the residual hourly wage rate.

In table 2, we present results derived from the more detailed BA-panel. Again, we see some heterogeneity across industries. The estimates are similar, yet a bit lower than the ones in table 1. The employment weighted average risk to residual monthly wages stands at around 6 %. The differences in the estimated values for permanent income risk stem mainly from the use of different data. In particular, income risk estimates are usually sensitive to sample length. More importantly, we do not rely on level values in our estimations below. Instead we estimate the effect using fixed-effect methods in a panel setting.

The above estimates are somewhat lower than those found in other studies (e.g. Krebs et al. (2010)). Note however, that this latter study, as well as others, overestimates permanent income risk since it assumes all remaining income variation after 4 quarters to be permanent, whereas we treat changes from one year to the next as transitory still. Furthermore, some studies rely on total household income which inherently has higher risk since it includes the outcomes of labor-leisure choice and substitution effects between household members. Additionally, it is plausible that by international standards the German labor market features lower income risk due to stronger institutions such as employment protection and wage bargaining coordination.

---

<sup>18</sup>Since our offshoring data is for the years after 1991 only, we do not show income risk estimates prior to 1991.

<sup>19</sup>Note that for sector 36, the estimate is negative which is unrealistic since a variance is by definition a positive value. This estimate, as well a few others, is not statistically significant, however. We will show later on that exclusion of the few insignificant income risk estimates does not alter much our estimates of the influence of offshoring on income risk.



**Table 1:** *Descriptives: Income Risk, GSOEP*

Industry	Code	$\hat{\sigma}_{\eta,j}^2$	$\hat{\sigma}_{\eta,j}$	Change( $\hat{\sigma}_{\eta,j}^2$ )
Food Products And Beverages	15	0.0080	0.0896	0.0103
Tobacco Products	16	0.0301	0.1736	-0.0022
Textiles	17	0.0044	0.0661	0.0027
Wearing Apparel; Dressing And Dyeing	18	0.0074	0.0859	-0.0048
Tanning,Dressing Of Leather; luggage	19	0.0376	0.1940	0.0210
Wood Products, Except Furniture	20	0.0012	0.0347	-0.0010
Pulp, Paper And Paper Products	21	0.0081	0.0901	0.0116
Publishing, Printing And Reproduction	22	0.0072	0.0850	-0.0074
Coke, Refined Petroleum Prod.	23	0.0126	0.1121	0.0067
Chemicals And Chemical Products	24	0.0067	0.0816	0.0124
Rubber And Plastic Products	25	0.0111	0.1055	0.0084
Other Non-metallic Mineral Products	26	0.0018	0.0425	-0.0006
Basic Metals	27	0.0085	0.0921	0.0263
Fabricated Metal Prod., Ex. Machinery	28	0.0043	0.0657	0.0165
Machinery And Equipment NEC	29	0.0054	0.0732	0.0021
Office Machinery And Computers	30	0.0278	0.1667	-0.0036
Electrical Machinery And Apparatus	31	0.0048	0.0690	-0.0020
Radio, Television And Communication	32	0.0029	0.0538	0.0028
Medical, Precision And Optical Instr.	33	0.0056	0.0751	0.0089
Motor Vehicles, Trailers	34	0.0071	0.0842	0.0003
Other Transport Equipment	35	0.0099	0.0994	-0.0051
Furniture; Manufacturing NEC	36	-0.0006		-0.0032

**Notes** Values for income risk are averages over time. Changes are first-to-last period differences of absolute values. The employment weighted industry average (excl. Tobacco) is 7,7 % ( $\hat{\sigma}_{\eta,j} = 0.077$ ). Industry names may be incomplete.

**Table 2:** *Descriptives: Income Risk, BA-panel*

Industry	Code	$\hat{\sigma}_{\eta,j}^2$	$\hat{\sigma}_{\eta,j}$	Change ( $\hat{\sigma}_{\eta,j}^2$ )
Food Products And Beverages	15	0.0037	0.0607	0.0008
Textiles	17	0.0043	0.0657	-0.0007
Wearing Apparel; Dressing And Dyeing	18	0.0041	0.0639	0.0069
Wood Products, Except Furniture	20	0.0026	0.0514	0.0074
Pulp, Paper And Paper Products	21	0.0028	0.0526	-0.0031
Publishing, Printing And Reproduction	22	0.0044	0.0664	-0.0023
Chemicals And Chemical Products	24	0.0025	0.0501	0.0014
Rubber And Plastic Products	25	0.0038	0.0619	-0.0010
Other Non-metallic Mineral Products	26	0.0031	0.0559	0.0041
Basic Metals	27	0.0030	0.0550	-0.0015
Fabricated Metal Prod., Ex. Machinery	28	0.0042	0.0649	-0.0009
Machinery And Equipment NEC	29	0.0035	0.0594	-0.0003
Office Machinery And Computers	30	0.0057	0.0754	-0.0129
Electrical Machinery And Apparatus	31	0.0034	0.0584	-0.0019
Radio, Television And Communication	32	0.0041	0.0638	0.0028
Medical, Precision And Optical Instr.	33	0.0035	0.0588	0.0017
Motor Vehicles, Trailers	34	0.0023	0.0483	0.0011
Other Transport Equipment	35	0.0030	0.0544	0.0015
Furniture; Manufacturing NEC	36	0.0041	0.0644	0.0006

**Notes** Values for income risk are averages over time. Changes are first-to-last period differences of absolute values. The employment weighted industry average is 5.8 % ( $\hat{\sigma}_{\eta,j} = 0.058$ ). Industry names may be incomplete.

## 2.4 Measuring the Offshoring Intensity

Offshoring is measured using input-output tables and trade data following a method introduced by Feenstra and Hanson (1996) and extended by Geishecker (2006). The offshoring intensities are calculated to represent the amount of an industry's intermediate inputs purchased from the same industry abroad in total industry output. This emphasizes the fact that the product could have likely been produced at home as well, and precludes situations in which traditionally imported goods count as offshoring. The offshoring intensity therefore is assumed to describe the outcome of multiple firm's make-or-buy decisions aggregated to the sector level. Note that it captures offshoring that occurs within as well as outside of a firm. In terms of the original notation introduced by Feenstra and Hanson (1996) our measure is the offshoring intensity in a "narrow" sense. Technically it looks as follows:

$$OFF_{jt} = \frac{IMP_{j^*t} \times \Omega_{j^*jt}}{Y_{jt}}. \quad (11)$$

$Y_{jt}$  is output of  $j$  at time  $t$ .  $\Omega_{j^*jt}$  describes the share of imports from a specific 2-digit NACE industry ( $j^*$ ) abroad used in the respective industry ( $j$ ) at home. These shares are derived from yearly import matrices that are part of the input-output tables provided by the Statistical Office in Germany.<sup>20</sup>  $IMP_{j^*t}$  are imports from the foreign industry  $j^*$ , taken from the OECD STAN database. The data on imports and industry output are deflated using an aggregate manufacturing import price deflator and industry-specific producer price indices, respectively. This deflation strategy may be problematic, however, if sector-level import prices deviate strongly from the average. Consider, for example, a situation in which the import price falls strongly for a certain industry. This fall will not be adequately captured by the average import price index which will be "too high". Yet, to the extent that the same price trends are also present in the producer prices, where they are adequately represented due to the more disaggregated indices, there will be an "asymmetric" deflation that by itself raises the offshoring intensity. In the subsequent estimations we therefore also check whether deflating all variables with aggregate indices affects the results.

We furthermore differentiate between worldwide offshoring and offshoring to non-OECD countries. Here we again draw on the OECD STAN database and multiply the imports in (11) by the share of imports coming from non-OECD countries.<sup>21</sup> Note that

---

<sup>20</sup>For the years prior to 1995 those tables are not comparable to the more recent ones due to data revisions. For those years we keep  $\Omega_{j^*jt}$  constant at its 1995 value - a strategy commonly employed in the literature whenever yearly I-O tables are not available (see e.g. Hijzen and Swaim (2010)).

<sup>21</sup>When calculating import shares for non-OECD countries, we had to aggregate sectors 15-16; 17-19 and 21-22. Note, however, that this only applies to the non-OECD trade share and neither to total imports nor  $\Omega_{j^*jt}$ .

this region-specific calculation of offshoring entails the common assumption of identical  $\Omega_{j*jt}$  for the two groups of countries, since the input-output tables do not hold any region specific information. The special distinction of non-OECD offshoring is meant to reflect the cost savings motive inherent in offshoring - a concept at the core of most theoretical approaches as well as the common public worries.

Table 3 shows offshoring intensities for the different manufacturing industries. Overall, worldwide offshoring has reached significantly higher levels than offshoring to low-income countries. Yet, starting from low values, growth is much stronger for offshoring to non-OECD countries where intensities have more than doubled in 9 industries. Additionally, we observe positive growth in all industries but tobacco as well as coke and refined petroleum for non-OECD offshoring, while only about two thirds of the industries had a higher worldwide offshoring intensity in 2005 compared to 1991. Interestingly, for both measures the sectors show quite some heterogeneity with respect to variations over time. This variation will be important in identifying the effect of offshoring on income risk later on.

**Table 3:** *Offshoring - descriptives*

Industry	Code	worldwide			non-OECD		
		1991	2005	change	1991	2005	change
Food Products And Beverages	15	3.85	3.97	0.12	0.61	0.63	0.02
Tobacco	16	1.00	0.88	-0.13	0.16	0.14	-0.02
Textiles	17	10.70	8.79	-1.91	3.95	4.42	0.47
Wearing Apparel; Dressing	18	12.13	12.94	0.81	4.48	6.51	2.03
Tanning And Dressing of Leather,	19	19.30	18.19	-1.11	7.13	9.15	2.02
Wood Products, Except Furniture	20	4.73	3.49	-1.24	1.06	1.11	0.06
Pulp, Paper And Paper Products	21	9.87	8.87	-1.01	0.40	0.54	0.15
Publishing, Printing	22	0.47	0.92	0.45	0.02	0.06	0.04
Coke, Refined petroleum products	23	3.12	3.33	0.21	0.56	0.45	-0.10
Chemicals And Chemical Products	24	11.77	13.73	1.96	0.81	0.98	0.18
Rubber And Plastic Products	25	1.05	1.48	0.43	0.08	0.19	0.12
Other Non-metallic Mineral Products	26	2.36	2.08	-0.28	0.27	0.34	0.07
Basic Metals	27	12.65	16.35	3.70	2.19	3.36	1.17
Fabricated Metal Prod., excl. Mach.	28	1.15	1.81	0.66	0.23	0.37	0.15
Machinery And Equipment NEC	29	4.48	7.35	2.86	0.54	1.94	1.40
Office Machinery And Computers	30	16.60	13.85	-2.75	2.51	6.06	3.56
Electrical Machinery	31	2.84	6.57	3.73	0.39	1.52	1.13
Radio, Television, Communication	32	17.67	19.75	2.07	3.33	6.99	3.66
Medical, Precision And Optical	33	2.52	4.52	2.01	0.25	0.71	0.46
Motor Vehicles, Trailers	34	12.71	10.21	-2.49	0.39	0.55	0.16
Other Transport Equipment	35	10.12	13.03	2.91	0.37	1.18	0.81
Furniture; Manufacturing NEC	36	2.21	9.42	7.20	0.61	3.81	3.20

**Notes:** Values are calculated according to  $OFF_{jt} = \frac{IMP_{j*jt} \times \Omega_{j*jt}}{Y_{jt}}$  and represent percentage values. Changes are absolute changes.

### 3 Econometric Specification

We now turn to developing a suitable estimation strategy for an evaluation of the impact of offshoring on income risk. The data at hand permits a panel approach controlling for unobserved heterogeneity in two dimensions: industry and time. Industry-specific effects may well matter for the relationship between offshoring and income risk. Some industries are probably more inherently risky than others. This may be due to different demand elasticities for their products or unique employment structures in terms of jobs and tasks that can differ in their idiosyncratic risk. As long as these characteristics are specific to an industry and do not vary over time, a fixed-effects setup will capture this type of unobserved heterogeneity. For time-varying coefficients that are unobservable to us, such as business cycle effects at the country or world level, we can employ time fixed-effects which capture this variation as long as it is uniform across industries. All remaining variation will have to be picked up by the variables included in the model. These will naturally be measures for offshoring along with controls for technological change, and other time-varying industry specific variables. We will specify the exact nature of the control vector further below. At this point it is sufficient to state that identification of the effect of offshoring on income risk will be based on differential movements in sector-level offshoring over time. A further point deserves attention. Given the structure of our dataset, we have to be careful when calculating standard errors (Krebs et al. (2010)). Our dependent variable  $\sigma_{\eta jt}^2$  is by itself the outcome of an estimation at the sector-level. With different standard errors across sectors from the first-stage estimations, we are facing heteroscedasticity. Furthermore, there is the possibility of serial dependence of error terms within sectors. We therefore follow the literature in reporting robust standard errors.<sup>22</sup>

With the above considerations in mind, we arrive at the following empirical models, where the first one is applied to the long-run dataset based on  $m$  5-year average values and the second model is used in the analysis of the yearly data. Importantly, this latter model also allows for the inclusion of lagged effects of offshoring on income risk:

$$\sigma_{\eta jm}^2 = \beta_1 OFF_{jm} + \gamma X_{jm} + \phi_j + \varphi_m + \nu_{jm} \quad (12)$$

$$\sigma_{\eta jt}^2 = \sum_{i=0}^N \beta_i OFF_{jt-i} + \gamma X_{jt} + \phi_j + \varphi_t + \nu_{jt} \quad (13)$$

In these models, the control vector  $X_{jt}$  holds a variable approximating technological progress using the share of R&D expenditure in industry value-added as suggested by the literature. Country-wide trends in technology upgrading that are unrelated to offshoring but impact on income risk are picked up by the year effects. Furthermore, it includes mea-

---

<sup>22</sup>Krebs et al. (2010) state that the dependent variable being the outcome of an estimation does not introduce a bias in the coefficient estimates.

asures for the export-share in production (capturing another dimension of dependency on international output fluctuations), the import penetration ratio (to provide for a comparison with the literature – Krishna and Senses (2009) in particular), and the industry level labor share of income (meant to broadly capture the influence of labor market institutions on income risk).<sup>23</sup> In addition we use different measures for the offshoring intensity based on an alternative deflation strategy (using aggregate price indices for both imports and output) and differentiate between worldwide offshoring and offshoring to non-OECD countries, the latter again based on the standard deflation procedure. In both cases  $\phi_j$  represents the industry fixed-effects.  $\varphi_m$  and  $\varphi_t$  are binary variables for 5-year periods ( $m$ ) and years ( $t$ ), respectively.  $\nu_{jm}$  and  $\nu_{jt}$  represent the two model’s error terms.

## 4 Results: Offshoring Lowers Income Risk.

In this subsection we present the results based on the above models. We begin with a discussion of model 1’s results and subsequently turn to model 2.

Table 4 has a clear message: an increase in offshoring correlates with lower income risk. We find negative coefficients on the different offshoring variables throughout columns (1) to (6) in table 4. The results are statistically significant as well. The coefficient value in column (1) implies that, on average, an increase in the offshoring intensity by one percentage point - which is close to but a little lower than the actual observed change in aggregate manufacturing offshoring of about 1.3 percentage points - decreases the permanent component of income risk by -0.00131. Compared to its (employment weighted) mean across industries and over time of 0.0060, this represents a decrease of more than 20% for every percentage point increase in the overall offshoring intensity. The effect is stronger for offshoring to non-OECD countries. The results in column (3) show the effect to be roughly three times the size of the corresponding value for worldwide offshoring. This type of offshoring, however, shows a smaller absolute increase over time; roughly half a percentage point.

Including a number of sector-level control variables leaves the main message untouched. Offshoring is still a negative and significant influence on income risk. Yet, the coefficients of the control variables hold a small bit of additional information. The import penetration ratio is found to increase income risk. A finding which weakly confirms the result found in Krishna and Senses (2009) for the US also for Germany. The labor share on the other hand correlates negatively with permanent income risk. This may express the influence labor market institutions and union presence have in smooth-

---

<sup>23</sup>All these data are retrieved from the OECD STAN database.

ing the long-run income path. The R&D share does not have any significant effects. It seems as if this variable is unable to approximate technological change above common aggregate-level trends captured by the time dummies. Overall, the above results suggest that offshoring-induced structural change within manufacturing - with an ever higher share of tasks located abroad - is associated with a decrease in income risk.

**Table 4:** *Results based on 5-year averages, 1991-2005*

income risk (permanent component)	1	2	3	4	5	6
offshoring intensity (world)	-0.131** (0.0586)			-0.179** (0.0659)		
offshoring intensity (world; alt. defl.)		-0.105* (0.0585)			-0.139** (0.0653)	
offshoring intensity (non-OECD)			-0.350** (0.165)			-0.379* (0.213)
export-share in production				-0.0667 (0.0417)	-0.0253 (0.0402)	-0.0514 (0.0348)
import penetration				0.0705 (0.0432)	0.0350 (0.0385)	0.0674* (0.0375)
RnD share in value added				7.03e-05 (0.000346)	0.000117 (0.000332)	-1.98e-05 (0.000399)
laborshare				-0.0293* (0.0162)	-0.0276 (0.0180)	-0.0290* (0.0165)
time-period fixed-effects	yes	yes	yes	yes	yes	yes
industry fixed-effects	yes	yes	yes	yes	yes	yes
Observations	66	66	66	63	63	63
R-squared	0.186	0.200	0.181	0.288	0.232	0.287
Number of sectors	22	22	22	21	21	21

**Notes:** Estimation is by fixed-effects. The coefficient values on the offshoring measures are to be understood as follows: a one unit change in offshoring (= percentage point change) corresponds to a  $\hat{\beta}/100$  change in the variance of persistent changes in the unexplained component of income (= permanent income risk). Sector 36 has incomplete data coverage which leads to a slightly reduced number of observations in some cases. Robust standard errors are shown in parentheses; \*\*\*  $p < 0.01$ , \*\*  $p < 0.05$ , \*  $p < 0.1$ .

In table 5, we turn to the results based on model 2 using yearly data. Again, we find income risk to be reduced by an increase in offshoring. We present results for one-year lagged values of offshoring as explanatory variables, because we do not find any significant contemporaneous correlation. This points to the impact offshoring has on income risk as the outcome of a change in how employment and production are organized internationally. Recall, that income risk measures shocks from an ex-ante perspective, i.e. it describes how shocks at a given time play out over future periods. We can therefore state that, on average, workers in an industry that shifts more tasks abroad will subsequently face less severe shocks to permanent income.<sup>24</sup>

The coefficient values are somewhat smaller now, thus implying a decrease in income risk of only about 8% compared to the mean value following an increase in the overall offshoring intensity by one percentage point. The results are not strictly comparable to

<sup>24</sup>This does not say anything about the possible effects of displacements at the margin of offshoring. Yet, offshoring does not seem to be a major cause of overall job-loss at the sector-level (OECD (2007)).

the ones of model 1, however, because they are based on different datasets and a different estimation of income risk itself.<sup>25</sup> Furthermore, for offshoring to non-OECD countries, which again triggers larger coefficients, we also find significant effects of two-year lagged offshoring intensities.<sup>26</sup> This could point to model 1's results representing a cumulative effect over the multiple-year period. Turning back to the estimates on single period lags, the coefficient for non-OECD offshoring implies roughly a forty percent decrease in permanent income risk for every percentage point increase in offshoring (compared to the mean value of income risk). Note, however, that average offshoring to non-OECD countries grew from 0.8% to 1.4% - a change of a little more than half a percentage point. With respect to the control variables, not much seems to be gained from their inclusion. None of them have a significant impact, although the labor share and the import penetration ratio show the same sign as in table 4.

In summary, our results from both models show a negative and significant effect of offshoring on the permanent component of income risk. Offshoring to non-OECD countries has a particularly strong effect.

**Table 5:** *Results based yearly data, 1999-2005*

income risk (permanent component)	1	2	3	4	5	6
1-year lagged offshoring intensity (world)	-0.0282* (0.0148)			-0.0278* (0.0139)		
1-year lagged offshoring intensity (world; alt. defl.)		-0.0344* (0.0188)			-0.0291* (0.0144)	
1-year lagged offshoring intensity (non-OECD)			-0.145* (0.0715)			-0.120** (0.0552)
export-share in production				-0.0314* (0.0180)	-0.0291 (0.0168)	-0.0275 (0.0174)
import penetration				0.0227 (0.0197)	0.0226 (0.0190)	0.0218 (0.0197)
RnD share in value added				0.000162 (0.000179)	0.000104 (0.000152)	4.43e-05 (0.000136)
laborshare				0.00109 (0.00741)	0.00232 (0.00687)	0.00289 (0.00623)
year fixed-effects	yes	yes	yes	yes	yes	yes
industry fixed-effects	yes	yes	yes	yes	yes	yes
Observations	114	114	114	108	108	108
R-squared	0.189	0.263	0.308	0.364	0.388	0.409
Number of sector	19	19	19	18	18	18

**Notes:** Estimation is by fixed-effects. The coefficient values on the offshoring measures are to be understood as follows: a one unit change in offshoring (= percentage point change) corresponds to a  $\hat{\beta}/100$  change in the variance of persistent changes in the unexplained component of income (= permanent income risk). Sector 36 has incomplete data coverage which leads to a slightly reduced number of observations in some cases. Robust standard errors are shown in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

<sup>25</sup> Furthermore, the BA-panel data do not allow us to estimate income risk for manufacturing sectors 19 and 23, which turn out to be marked by particularly high levels of income risk. Excluding those sectors in the estimation of model 1 lowers the coefficient on the offshoring variable and brings it closer to the values obtained from model 2.

<sup>26</sup> The results are not shown in the present table for the sake of expositional clarity. The coefficient value for 2-year lagged non-OECD offshoring is -.11 with a robust standard error of .062 for the model including all controls.

## 5 Concluding Remarks

The analysis in this paper aims at delivering insights into the reasons for changes in income risk. Income risk is an important factor in determining the consumption, savings and also growth patterns of an economy. We single out offshoring as a potential influence given the anxiety it regularly stirs up in the public debate as well as its growing role as a large part of international trade transactions. Within the limits of our available data, we seek to answer whether the fears regarding income insecurity often associated with it are justified. We find that they are not. On the contrary, within manufacturing sectors, offshoring is associated with a *decrease* in permanent income risk.

In our empirical analysis, we first estimate sector-level income risk from individual level data, isolating the welfare-relevant permanent component for two different datasets. We then link it to offshoring at the sector level in a panel framework. We find offshoring to have a negative and statistically significant effect on income risk for employees within sectors in manufacturing. Furthermore, there is strong evidence for a differentiated impact across destination regions, with a stronger than average effect for offshoring to non-OECD countries. This is expected as offshoring in this case is closer to a process of wage related labor substitution in an ongoing reallocation of different tasks around the globe.

However, with respect to welfare implications the results are less straight forward. Clearly, taken by itself, a reduction in income risk brought about by a higher offshoring intensity would imply a positive welfare effect. Yet, this effect might not be the only welfare-affecting change. Two points deserve particular attention. First, the wage level matters as well. Individuals may have a smaller benefit if risk decreases but this comes as a trade-off with lower average wages. Yet, on an aggregate level, this is not necessarily to be expected. Grossman and Rossi-Hansberg (2008) theoretically show that the wage effects of offshoring are ambiguous, and empirical evidence often documents relative wages for different skill groups to change while *overall* wages are hardly affected. Leaving considerations with respect to a skill-specific effect to further research, we are therefore leaning towards the conclusion that lower income risk does not come at the cost of lower average wages in manufacturing.

The second possible concern is related to employment levels. A shift of more volatile occupations (or tasks) abroad may change average income risk in the home country at the expense of lower overall employment levels. The volatile jobs would move offshore and – as a consequence – the remaining ones show a lower average risk. Yet, it is hard to argue that this situation is desirable from an aggregate perspective if overall employment falls.



Ideally, if composition effects are at work, one would want the home employment to stay constant or to grow due to productivity effects from offshoring and the workers whose tasks are moved offshore would find re-employment in less volatile jobs. There are some hints that offshoring is not responsible for falling employment levels in manufacturing. For instance, the OECD states that "*(...) the industrial sectors that have most downsized their workforce are not the ones that have most engaged in offshoring. Offshoring does not therefore emerge as a major cause of job losses.*" (OECD (2007)). This finding has recently been confirmed by Harrison and McMillan (2011) for the United States, who find most of the manufacturing employment decline to be a result of capital-labor substitution rather than international labor reallocation. We therefore conclude on a slightly optimistic tone. If offshoring lowers income risk while average wages do not fall and overall employment stays widely unaffected, there may be positive effects on welfare.

## References

- Aiyagari, S. (1994). Uninsured idiosyncratic risk and aggregate saving. *The Quarterly Journal of Economics*, 109(3):659–684.
- Becker, S. and Muendler, M. (2008). The Effect of FDI on Job Security. *The BE Journal of Economic Analysis & Policy*, 8(1).
- Bergin, P., Feenstra, R., and Hanson, G. (2009). Offshoring and Volatility: Evidence from Mexico’s Maquiladora Industry. *The American Economic Review*, 99(4):1664–1671.
- Buch, C. and Lipponer, A. (2010). Volatile multinationals? Evidence from the labor demand of German firms. *Labour Economics*, 17(2):345–353.
- Carroll, C. and Samwick, A. (1997). The nature of precautionary wealth. *Journal of Monetary Economics*, 40(1):41–71.
- Constantinides, G. and Duffie, D. (1996). Asset pricing with heterogeneous consumers. *The Journal of Political Economy*, 104(2):219–240.
- Dustmann, C., Ludsteck, J., and Schoenberg, U. (2009). Revisiting the german wage structure. *Quarterly Journal of Economics*, 124(2):843–881.
- Feenstra, R. (2010). *Offshoring in the global economy: microeconomic structure and macroeconomic implications*. The MIT Press.
- Feenstra, R. and Hanson, G. (1996). Globalization, outsourcing, and wage inequality. *The American Economic Review*, 86(2):240–245.
- Gartner, H. (2005). The imputation of wages above the contribution limit with the german iab employment sample. *FDZ Methodenreport*, 2:2005.
- Geishecker, I. (2006). Does outsourcing to Central and Eastern Europe really threaten manual workers’ jobs in Germany? *World Economy*, 29(5):559–583.
- Geishecker, I. and Görg, H. (2008). Winners and losers: a micro-level analysis of international outsourcing and wages. *Canadian Journal of Economics*, 41(1):243–270.
- Gottschalk, P. and Moffitt, R. (1994). The growth of earnings instability in the US labor market. *Brookings Papers on Economic Activity*, 1994(2):217–272.
- Grossman, G. and Rossi-Hansberg, E. (2008). Trading tasks: a simple theory of offshoring. *American Economic Review*, 98(5):1978–1997.
- Harrison, A. and McMillan, M. (2011). Offshoring jobs? multinationals and us manufacturing employment. *The Review of Economics and Statistics*, 93(3):857–875.

- Hijzen, A. and Swaim, P. (2010). Offshoring, labour market institutions and the elasticity of labour demand. *European Economic Review*, 54(8):1016–1034.
- Kohler, W. and Wrona, J. (2010). Offshoring Tasks, yet Creating Jobs? *CESifo Working Paper Series*, 3019.
- Krebs, T. (2003). Human Capital Risk and Economic Growth. *Quarterly Journal of Economics*, 118(2):709–744.
- Krebs, T., Krishna, P., and Maloney, W. (2010). Trade policy, income risk, and welfare. *The Review of Economics and Statistics*, 92(3):467–481.
- Krebs, T. and Yao, Y. (2009). Measuring Income Risk in the German Labor Market. *mimeo, Mannheim University*.
- Krishna, P. and Senses, M. (2009). International trade and labor income risk in the United States. *NBER Working Paper*.
- Levine, D. and Zame, W. (2002). Does market incompleteness matter? *Econometrica*, 70(5):1805–1839.
- Meghir, C. and Pistaferri, L. (2004). Income variance dynamics and heterogeneity. *Econometrica*, 72(1):1–32.
- OECD (2007). Offshoring and Employment: Trends and Impacts. *OECD Report*.
- Schmucker, A. and Seth, S. (2009). Ba-employment panel 1998-2007, codebook (only in german). *FDZ Datenreport*, 1.
- Senses, M. (2010). The effects of offshoring on the elasticity of labor demand. *Journal of International Economics*, 81(1):89–98.
- Storesletten, K., Telmer, C., and Yaron, A. (2004). Cyclical dynamics in idiosyncratic labor market risk. *Journal of Political Economy*, pages 695–717.

## Appendix

This first additional table (6) shows results from the first stage regression generating the income residuals. Coefficients on sector fixed-effects are not shown. The results are based on BA data with imputed wages from the cross section for the year 2005. Results for any other year virtually look the same. All coefficients have the expected sign and significance. That is, income grows with age, skill, firm size, etc.

**Table 6:** *First stage wage regression for 2005*

ln wage	1
age	0.00893*** (0.000101)
foreign nationality	-0.0984*** (0.00343)
firm size	0.0532*** (0.000612)
medium skilled	0.218*** (0.00517)
highly skilled	0.480*** (0.00324)
constant	7.169*** (0.00661)
sector fixed effects	yes
Observations	72,904
R-squared	0.461

The following table 7 provides results from using BA data from the June waves only. As in all previous tables, offshoring is associated with a decrease in permanent income risk.

In table 8 we address the concern of some income risk estimates being individually insignificant when using GSOEP data. (With the BA data we do not face this problem to any comparable extent.) We simply drop these observations and re-run the regressions.

**Table 7: Results based yearly data, 1999-2005, June waves only**

income risk (permanent component)	1	2	3	4	5	6
1-year lagged offshoring intensity (world)	-0.0107** (0.00470)			-0.00849 (0.00677)		
1-year lagged offshoring intensity (world; alt. defl.)		-0.0199*** (0.00559)			-0.0121** (0.00421)	
1-year lagged offshoring intensity (non-OECD)			-0.0707*** (0.0222)			-0.0322 (0.0189)
export-share in production				-0.0383 (0.0228)	-0.0378 (0.0226)	-0.0371 (0.0233)
import penetration				0.0280 (0.0248)	0.0288 (0.0244)	0.0275 (0.0254)
RnD share in value added				0.000128 (0.000146)	0.000110 (0.000146)	9.39e-05 (0.000157)
laborshare				6.63e-05 (0.00576)	0.000871 (0.00537)	0.000451 (0.00594)
year fixed-effects	yes	yes	yes	yes	yes	yes
industry fixed-effects	yes	yes	yes	yes	yes	yes
Observations	114	114	114	108	108	108
R-squared	0.085	0.133	0.126	0.332	0.344	0.334
Number of sector	19	19	19	18	18	18

**Notes:** Estimation is by fixed-effects. The coefficient values on the offshoring measures are to be understood as follows: a one unit change in offshoring (= percentage point change) corresponds to a  $\hat{\beta}/100$  change in the variance of persistent changes in the unexplained component of income (= permanent income risk). Sector 36 has incomplete data coverage which leads to a slightly reduced number of observations in some cases. Robust standard errors are shown in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

**Table 8: Results for 5-year averages, 1991-2005, individually significant risk estimates only**

income risk (permanent component)	1	2	3	4	5	6
offshoring intensity (world)	-0.187 (0.126)			-0.235*** (0.0531)		
offshoring intensity (world; alt. defl.)		-0.180 (0.131)			-0.241*** (0.0554)	
offshoring intensity (non-OECD)			-0.421*** (0.132)			-0.508** (0.217)
export-share in production				0.00805 (0.0581)	0.00430 (0.0585)	0.0658 (0.0545)
import penetration				0.00191 (0.107)	0.00820 (0.107)	-0.0600 (0.0960)
RnD share in value added				-0.00194** (0.000896)	-0.00208** (0.000901)	-0.000936 (0.000966)
laborshare				-0.0621 (0.0602)	-0.0617 (0.0597)	-0.0596 (0.0682)
time-period fixed-effects	yes	yes	yes	yes	yes	yes
industry fixed-effects	yes	yes	yes	yes	yes	yes
Observations	27	27	27	27	27	27
R-squared	0.338	0.330	0.240	0.611	0.615	0.525
Number of sectors	15	15	15	15	15	15

**Notes:** Estimation is by fixed-effects. The coefficient values on the offshoring measures are to be understood as follows: a one unit change in offshoring (= percentage point change) corresponds to a  $\hat{\beta}/100$  change in the variance of persistent changes in the unexplained component of income (= permanent income risk). Sector 36 has incomplete data coverage which leads to a slightly reduced number of observations in some cases. Robust standard errors are shown in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.