# Trade, Diaspora and Migration to New Zealand

Paper prepared for the NZIER 50th Anniversary Research Award

David Law Murat Genç John Bryant

31 March 2009

# **Executive summary**

Debates about the economic contribution of migrants in New Zealand typically focus on migrants' contribution towards addressing skill shortages. But migration may make another, more subtle, contribution to the New Zealand economy. Through their ability to speak languages, navigate legal systems, and draw on social and commercial networks in their origin countries, migrants can potentially reduce barriers to international trade. The same reasoning applies to New Zealanders overseas. Migrants and the diaspora could together increase New Zealand's links with global markets.

Subjecting this idea to rigorous testing is difficult. There are many factors, ranging from technological change to colonial links to macroeconomic conditions, that affect both migration and trade and hence obscure the causal relationship between them. However, by assembling a large, longitudinal cross-country dataset, and applying a battery of econometric models and tests, we are able to control for problems of confounding.

We find that migration does indeed stimulate trade. According to our benchmark model, if New Zealand receives 10 percent more migrants from a particularly country, New Zealand's exports to that country grow by 0.6 percent, and New Zealand imports from that country grow by 1.9 percent. These estimates fall within the range obtained in overseas studies.

Our results suggest that migration stimulates imports more than exports. One possible explanation for this finding is that the types of goods that New Zealand imports involve greater information problems of the sort solved by migrants than the types of goods that New Zealand exports. Further research on this topic might yield insights on how the contribution of migration to exports could be enhanced

Our results suggest that migrants in New Zealand do more to stimulate international trade than New Zealanders overseas. The reason is that migrants in New Zealand come from a diverse range of countries, including many developing and non-Engish speaking countries where there are relatively large barriers to international trade, whereas the New Zealand diaspora is concentrated in a few culturally similar destinations. We find that the effect of migration on tourism is several times stronger than the effect on merchandise trade. This might be because migrants' country-specific knowledge of things such as food, language, and protocols are particularly important in tourism. It might also be because migrants transmit a positive image of New Zealand to their origin countries.

Finding that migration stimulates trade has implications for the design of immigration policy. A policy focused on skill shortages values English-language skills and the ability to quickly fit into the host society. In contrast, a policy focused on migrants' ability to facilitate trade values skills in languages other than English, and an ability to operate in cultures other than New Zealand.

# **1. Introduction**

Almost a quarter of all New Zealanders are overseas-born<sup>1</sup>, which is one of the highest migrant concentrations in the OECD. Policy discussions of the benefits of migration to the New Zealand economy typically emphasise migrants' role in relieving skills shortages. These effects are relatively easily measured through, for instance, survey data on migrants' educational qualifications or labour market outcomes. But migrants may impart another, less directly measurable, benefit. Through their ability to speak languages, navigate legal systems, and draw on social and commercial networks in their origin countries, migrants may be able to reduce barriers to international trade. The same reasoning applies to New Zealanders overseas. Migrants and the diaspora may together increase New Zealand's links with global markets.

In this paper, we test whether migration has in fact had this trade-enhancing effect. We test whether, all else equal, countries with larger stocks of migrants (whether overseas-born in New Zealand or New Zealand-born overseas) have more international trade with New Zealand. We consider merchandise exports and imports, and also tourism. Our models control for standard determinants of trade that might be confounded with migration, such as the size of the economy or the distance to New Zealand. By applying panel data techniques, we also control for unobserved permanent characteristics of countries, and global trends that might stimulate both migration and trade. A further refinement is that we allow for the fact that some countries do not trade with New Zealand at all.

We find that migration does indeed boost trade. The effect on merchandise imports is larger than the effect on merchandise exports. The effect is also larger for countries that are more difficult for New Zealand to trade with: developing countries, and countries where English is not the dominant language. However, the strongest effects occur not with merchandise trade but with tourism. The finding of a positive relationship between migration and trade has implications for immigration policy. Immigration policies that see migration as a way of addressing to skills shortages emphasize different things from policies that see migration as a way of facilitating international trade.

<sup>&</sup>lt;sup>1</sup> Data from the 2006 Census of Population and Dwellings, obtained from the Statistics New Zealand website www.stats.govt.nz.

# 2. Trends in migration and trade

Between 1981 and 2006 the number of overseas-born people usually resident in New Zealand rose from approximately 450,000 to 920,000, an increase of more than 100%<sup>2</sup> As Table 1 shows, the sources of migrants also became more diverse, with particularly large increases in migrants from Asia and Africa. The data in Table 1 suggest that New Zealand is developing migrant communities from an increasingly wide variety of countries. For instance, the number of countries for which New Zealand had at least one thousand migrants increased from 28 in 1981 to 55 in 2006, and the number of countries for which New Zealand had at least one thousand migrants increased from 5 to 16.<sup>3</sup>

The dramatic changes in New Zealand's migrant population followed from changes in immigration policy. From the mid-1980s official preferences for "traditional" migrant sources were ended, and decisions were based mostly on personal characteristics such as qualifications and age (Goodwin, Bedford and Lidgard 1998). This provides partial reassurance that migration was not responding to trade *per se*, which would bias upwards our estimates of the effect of migration on trade.<sup>4</sup>

The number of New Zealand-born living outside the country, while not as large as the number of overseas-born living in the country, was just over half a million (or approximately 15% of the global New Zealand-born population) in 2000. A potentially important difference between New Zealand's diaspora and migrant stocks is that the diaspora are relatively more concentrated in a small number of English speaking countries. Indeed, in 2000 the number of countries for which New Zealand had diaspora greater than one thousand was 19. In only 4 of those countries was the diaspora greater than ten thousand.

New Zealand's imports and exports have also grown substantially over the period 1981-2006. Table 1 presents estimates based on data from the United Nations Commodity Trade Database (Comtrade). Trade values in Comtrade are reported in nominal US dollars; we have converted

<sup>&</sup>lt;sup>2</sup> To calculate these figures we assumed that census respondents whose birthplace was unspecified or undefined had the same probability of being foreign-born as respondents who did have a clear birthplace.

<sup>&</sup>lt;sup>3</sup> Bryant and Law (2004) contains a more detailed analysis of trends in New Zealand's foreign-born population between 1981 and 2001.

<sup>&</sup>lt;sup>4</sup> For more discussion on the direction of causation between migration and trade see Gould (1994: 310).

these into 2006 NZ dollars by multiplying by the NZ-US exchange rate, and then dividing by aggregate merchandise import and export price deflators.

As with migration, there is substantial geographic variation in growth rates. Trade with the United Kingdom, for instance, has increased relatively little, while trade with Asia and Africa have increased markedly. New Zealand has increased the number of countries with which it conducts substantial international trade. Between 1981 and 2006, the number of countries from which New Zealand imported goods worth at least \$100 million (in 2006 NZ dollars) increased from 14 to 38. During the same period, the number of countries to which New Zealand exported goods worth at least \$100 million increased from 24 to 39.<sup>5</sup>

<sup>&</sup>lt;sup>5</sup> Bryant, Genç, and Law (2009) contains a more detailed analysis of trends in New Zealand's trade between 1981 and 2006.

|                     | Diaspora by<br>region<br>(thousands) | Populatior<br>region o | n of New Ze<br>f birth (tho | ealand by<br>usands) | Exp<br>(NZ\$ | orts by regi<br>2006 millio | on<br>ons) | Imp<br>(NZ\$ | orts by regi<br>2006 milli | on<br>ons) |
|---------------------|--------------------------------------|------------------------|-----------------------------|----------------------|--------------|-----------------------------|------------|--------------|----------------------------|------------|
|                     | 2001                                 | 1981                   | 2006                        | Incr.                | 1981         | 2006                        | Incr.      | 1981         | 2006                       | Incr.      |
| Australia           | 356                                  | 44                     | 63                          | 43%                  | 1,856        | 6,784                       | 266%       | 1,982        | 8,171                      | 312%       |
| East Asia           | 5                                    | 6                      | 135                         | 2150%                | 2,333        | 7,318                       | 214%       | 2,183        | 10,065                     | 361%       |
| Pacific             | 6                                    | 58                     | 136                         | 134%                 | 594          | 1,166                       | 96%        | 132          | 132                        | 0%         |
| United Kingdom      | 58                                   | 249                    | 244                         | -2%                  | 1,612        | 1,694                       | 5%         | 1,001        | 1,112                      | 11%        |
| Europe              | 26                                   | 49                     | 75                          | 53%                  | 1,843        | 3,975                       | 116%       | 1,313        | 5,913                      | 350%       |
| SE Asia             | 5                                    | 11                     | 58                          | 427%                 | 832          | 2,954                       | 255%       | 1,012        | 5,476                      | 441%       |
| Middle East         | 3                                    | 1                      | 14                          | 1300%                | 895          | 1,121                       | 25%        | 714          | 2,132                      | 199%       |
| Africa              | 6                                    | 14                     | 108                         | 671%                 | 305          | 1,308                       | 329%       | 129          | 682                        | 429%       |
| North America       | 36                                   | 12                     | 27                          | 125%                 | 1,841        | 5,101                       | 177%       | 2,238        | 5,620                      | 151%       |
| South America       | 1                                    | 3                      | 8                           | 167%                 | 305          | 1,212                       | 297%       | 86           | 415                        | 383%       |
| South Asia          | 3                                    | 1                      | 10                          | 900%                 | 43           | 311                         | 623%       | 17           | 93                         | 447%       |
| Other & Unspecified | 0                                    | 16                     | 191                         | 1094%                | 560          | 1,360                       | 143%       | 193          | 872                        | 352%       |
| New Zealand         | -                                    | 2,679                  | 2,960                       | 10%                  | -            | -                           | -          | -            | -                          | -          |
| Total               | 506                                  | 3,143                  | 4,028                       | 28%                  | 13,018       | 34,304                      | 164%       | 11,001       | 40,685                     | 270%       |

### Table 1 – New Zealand's Diaspora, migrants, exports and imports, by region, 1981-2006

Source – Population data from Statistics New Zealand unpublished census tabulations. Trade estimates calculated from the United Nations Statistics Division's Comtrade database. Diaspora data from the Global Migrant Origin Database. The imputation method used by the Gobal Migration Origin Database overstates the number of New Zealanders in countries with missing data. We modified their method, yielding estimates that were lower by approximately 21,000. The adjustments are described in the Appendix.

# 3. Mechanisms through which migrants could stimulate trade

Following Gould (1994), most authors postulate two mechanisms through which migration could stimulate trade between the host and origin countries: "transaction cost" effects, and "immigrant preference" effects.

### 3.1. Transaction cost effects

Migrants are expected to stimulate trade by lowering transaction costs. There are two related sets of reasons why immigrants might face lower transaction costs for trade with their country of origin. The first is that immigrants have superior knowledge of home country markets, languages, business practices, laws, and other matters related to trade. The second is that migrants may be able to participate in international networks, as exemplified by the networks of ethnic Chinese (Rauch and Trindade 2002). These networks can be conduits of information, and can deter opportunistic behaviour.

Transaction cost effects are generally expected to stimulate both exports and imports. Most authors argue that migrants' informational advantages are more important for differentiated goods than for homogenous goods, because of the greater information problems involved in the trade of differentiated goods. Most authors also argue that the trade-stimulating effect of migration is greatest when the host and origin countries have very different institutions, languages and cultures, and when alternative sources of information and contract enforcement are lacking, since this is when the special skills of migrants are most needed.

### 3.2. Immigrant preference effects

Immigrants are assumed to demand certain goods produced in their home countries, or similar to those produced in their home countries. These preferences are expected to boost imports to the host country but not exports from the host country. The effect is assumed to be more marked for differentiated goods than for homogenous goods. Some authors note that there may be a countervailing "immigrant substitution" effect. If there are sufficient immigrants in a country, these immigrants may begin to produce goods themselves rather than importing them (Dunlevy and Hutchison 1999, Girma and Yu 2002).

# 4. Literature Review

A growing number of studies have examined the effects of immigration on trade flows since the pioneering studies of Gould (1994) and Head and Ries (1998). Apart from Blanes (2005) and Blanes and Martín-Montaner (2006) who use an intra-industry-trade index as their dependent variable, all of these studies have used a gravity model, and have found a positive relationship between immigration and trade regardless of the different samples, specifications, and estimation methods used in them. However, the estimated magnitude of the elasticity of trade with respect to immigration differs greatly across these studies.

Table 2 summarises results from the twenty-four previous empirical studies of migration and trade that are published in academic journals. The studies cover eight host countries—the United States, Canada, the United Kingdom, France, Spain, Denmark, Australia, and Malaysia—and various trading partners, though in the case of Helliwell (1997) the trade question is between Canadian provinces and US states, and between different regions of France in the case of Combes et al (2005). Dunlevy and Hutchison (1999, 2001) use data from 1870 to 1910; all the other studies use more recent data. Half of these studies use trade data at the country level, the rest use state (U.S.) or province (Canada) or "department" (France) level data. Nearly all of the studies focus on the trade flows of English-speaking countries. The exceptions are Rauch and Trindade (2002), Blanes (2005), Combes et al. (2005), Blanes and Martín-Montaner (2006), Hong and Santhapparaj (2006), and White (2007a). Some studies use data from a single period, while others use time series techniques to combine data from several periods.

As is apparent from Table 2, the estimated magnitude of the immigration effect differs greatly across studies. If we focus on the studies that use country-level data, we observe that the immigrant elasticity of export ranges from 0.02 (Gould (1994)) to 0.57 (White (2007a)), implying that a 10% increase in migration leads to between 0.2% and 5.7% in exports. Similarly, the import elasticity ranges from 0.01 (Gould (1994)) to 0.88 (Hong and Santhapparaj (2006)), implying that a 10% increase in migration leads to between 0.1% and 8.8% increase in imports This variation is quite large, and can be due to the estimation technique (cross-section as opposed to panel estimation, for example), differences in specification, and samples. It is also interesting that the effect of migrants is not found to be consistently higher for imports than for

exports, suggesting that the immigrant preference effects may not be as important as the transaction cost effects of immigrants in many cases.

| Study                              | Sample   | Export elasticity                                | Import<br>elasticity         |
|------------------------------------|--|--|------------------------------|
| Gould (1994)                       | US and 47 trade partners; 1970-<br>1986                    | 0.02   | 0.01                         |
| Helliwell (1997)                   | Trade between Canadian provinces and US states, 1990       | 0.34   | 0.06 <sup>ns</sup>           |
| Head and Ries (1998)               | Canada and 136 trade partners; 1980-1992                   | 0.10   | 0.31                         |
| Dunlevy and Hutchinson (1999,2001) | US and 17 trade partners; 1870-<br>1910                    | 0.08   | 0.29                         |
| Girma and Yu (2002)                | UK and 48 trade partners; 1981-<br>1993                    | 0.16 <sup>a</sup>                                | 0.10 <sup>a</sup>            |
| Rauch and Trindade (2002)          | 63 countries; 1980, 1990                                   | $0.21/0.47^{b}$                                  | 0.21/0.47 <sup>b</sup>       |
| Wagner, Head, and Ries (2002)      | 5 Canadian regions and 160 foreign countries; 1992-1995    | 0.013  | 0.092                        |
| Co et al. (2004)                   | US state exports, 1993, 28 countries                       | 0.27 - 0.30                                      |                              |
| Bardhan and Guhatkakurta<br>(2004) | US state exports, 1994-1996, 51 countries                  | 0.24-0.26 <sup>c</sup><br>0.06-0.09 <sup>d</sup> |                              |
| Blanes (2005)                      | Total trade between Spain and 42 trade partners, 1991-1998 | 0.21 <sup>e</sup>                                | 0.21 <sup>e</sup>            |
| Combes et al (2005)                | 94 French "departments", 1993                              | $0.16 \text{ or} \\ 0.25^{\text{f}}$             | 0.16 or<br>0.25 <sup>f</sup> |
| Herander and Saavedra (2005)       | US state exports, 1993-1996, 36 countries                  | 0.18   |                              |
| Mundra (2005)                      | US with 47 trade partners, 1973-<br>1980                   | $+^{g}$  | $+^{g}$                      |
| Blanes and Martín-Montaner (2006)  | Spain and 48 non-EU trade partners, 1988-1999              | 0.47 <sup>h</sup>                                | 0.47 <sup>h</sup>            |
| Dunlevy (2006)                     | US average state exports, 1990-<br>1992, 87 countries      | 0.24 - 0.47                                      |                              |
| Hong and Santhapparaj (2006)       | Malaysia and 16 trade partners, 1998-2004                  | 0.53   | 0.88                         |

Table 2 – The effect of immigration on exports and imports in previous empirical papers

| White (2007a)               | Denmark and 170 trade partners, 1980-2000   | 0.23 - 0.57 | 0.19 - 0.33 |
|-----------------------------|---|-------------|-------------|
| White (2007b)               | US and 73 trade partners, 1980-2000         | 0.11        | 0.13        |
| White and Tadesse (2007)    | Australia and 101 trade partners, 1989-2000 | 0.47        | 0.18        |
| Bandyopadhyay et al. (2008) | US state exports, 29 countries, 1990, 2000  | 0.14        |             |
| Tadesse and White (2008a)   | US state exports, 75 countries, 2000        | 0.11        |             |
| Tadesse and White (2008b)   | US state exports, 75 countries, 2000        | 0.05        |             |
| White and Tadesse (2008)    | US state exports, 75 countries, 1998-2001   | 0.12        |             |

ns not statistically significant

<sup>a</sup> Trade with non-Commonwealth countries. The export and import elasticities with respect to immigrants are not statistically significant for trade between UK and Commonwealth countries.

<sup>b</sup>The estimate of 0.21 applies to homogenous goods, and 0.47 to differentiated goods; insufficient data were included in the article to allow the calculation of an overall elasticity. No distinction is made between imports and exports.

<sup>c</sup> West Coast, <sup>d</sup> East Coast.

<sup>e</sup> The coefficient of *log(immigrant stock)*, the dependent variable is the logistic transformation of GL index if intra-industry trade.

<sup>f</sup>Total trade elasticity, 0.26 if both immigrant and emigrant effects are included.

<sup>g</sup> Elasticities are not estimated as it is semiparametric estimation. The effect of immigration on exports is not necessarily positive for intermediate goods.

<sup>h</sup> The coefficient of *log(immigrant stock)*, the dependent variable is the logistic transformation of Brülhart's MITT A index if intra-industry trade.

<sup>k</sup> "Exports" refers to exports from Canada to Taiwan, "imports to imports to Canada from Taiwan.

Although different types of commodities (differentiated, homogeneous, consumer, producer, cultural) have been considered in the studies summarised in Table 2, none have looked at trade in services. In fact, we know of no studies that have looked at the effect of migrant stocks on exports of services, such as tourism, even though migration could plausibly lower transactions costs for trade in services in the same way that it lowers costs for trade in goods.

### 4.1. The gravity model

It is not surprising that the previous studies have used a gravity model for the specification of their models. The gravity model is one of the most commonly used specifications in empirical

trade research, and has been accepted as being 'extremely successful empirically,' in their ability to explain variance in bilateral trade volumes (Deardoff 1984). Learner and Levinsohn (1995) state that gravity models 'have produced some of the clearest and most robust empirical findings in economics.'

The basic idea behind the gravity model comes from the gravity theory in physics. Newton's law of universal gravitation states the gravitational attraction between two bodies is proportional to the product of their masses and inversely proportional to the square of the distance between them. In trade models, the physical bodies are the exporting and importing countries, and their "mass" is their economic mass. In other words, the idea is that the bigger the sizes of the economies, the bigger the trade, and the greater the distance, the lower the trade. Thus, the basic gravity model can be written as

$$m_{ij} = G\left(\frac{E_i E_j}{D_{ij}^2}\right),\tag{1}$$

where  $m_{ij}$  is the level of trade (exports, imports, or total trade) between countries *i* and *j*,  $E_i$  is the economic mass of country *i*,  $D_{ij}$  is the distance between *i* and *j*, and *G* is the gravitational constant. This can be expressed in logarithmic form as

$$\ln m_{ij} = \ln G + \ln(E_i E_j) - 2 \ln D_{ij}, \qquad (2)$$

which can be viewed as

$$\ln m_{ij} = \beta_0 + \beta_1 \ln(E_i E_j) + \beta_3 \ln D_{ij}.$$
(3)

From an econometric point of view, this is a very simple specification where the parameter  $\beta_I$  is the elasticity of trade with respect to the mass of the countries. In empirical trade models, the economic mass is typically proxied by the GDP (or some function of it) of the countries. It is also most common to extend the basic equation by including a number of factors that potentially facilitate or inhibit trade, such as cultural, geographical, and political characteristics. Such extended models are referred to as the 'augmented' gravity models. Although the gravity model has had a huge empirical success for a long time, a theoretical foundation in economics was not provided until Anderson (1979) derived the gravity equation from a model that assumed product differentiation. Bergstrand (1985, 1989) then associated the gravity equation with simple monopolistic competition. Helpman and Krugman (1985) justified the gravity model in a differentiated product framework with increasing returns to scale. Deardoff (1998) has shown that the gravity model characterizes many models and can be justified from standard trade theories. Anderson and van Wincoop (2003) derived an operational gravity model from a CES expenditure system. Helpman et al. (2008) has recently generalized their model by accounting for firm heterogeneity and fixed trade costs, and also for asymmetries between the volume of exports from *j* to *i* and the volume of exports from *i* to *j*.

### 4.2. The problem of zero trade

The standard approach to estimating the gravity model is to use the log-linear model in (3). Although this is very simple to implement, trade data often contain observations with zero trade which creates a problem since the logarithm of zero is not defined. Because the proportion of observations with zero trade is often quite significant, the way these zeros are handled is very important.

The elementary approach to handle the presence of zero trade is simply to discard such observations and use only the observations with a positive level of trade. Although this induces a sample selection bias if the zeros are not randomly distributed, many studies in Table 2 use this approach. (For example, Gould (1994), Helliwell (1997), Girma and Yu (2002), Mundra (2005), Hong and Santhapparaj (2006), White (2007b), and Bandyopadhyay (2008).)

A second approach is to add a constant factor, usually 1, to the volume of trade before taking its logarithm. Dunlevy and Hutchinson (1999, 2001), Dunlevy (2006), and Combes et al. (2005) use this approach. This is justified on the grounds that  $ln(1+trade)\approx ln(trade)$  for large values of *trade*, and  $ln(1+trade)\approx trade$  for small values of *trade*, approximating the semi-log Tobit relationship (Eichengreen and Irwin (1995)). Although this fixes the problem and allows estimation of (3) in a simple fashion, this procedure will generally lead to inconsistent estimators of the parameters of interest (Silva and Tenreyno (2006)). It also makes the results sensitive to the units in which the volume of trade is measured (Head and Ries (1998)).

A third approach is to treat zero trade as a corner solution and use a Tobit estimation procedure. Head and Ries (1998), Rauch and Trindade (2002), White (2007a), Tadesse and White (2008a, and 2008b) use this approach. Although the Tobit estimator deals with zero trade in a satisfactory way from an econometric point of view, it is very questionable in the presence of heteroskedastic or non-normal residuals as the MLE Tobit estimator is inconsistent in these circumstances.

Another approach is to treat the occurrence of zero trade as non-random and use a Heckman-type sample selection model. In this approach, a country's decision to trade with a potential trade partner is explicitly modeled, allowing one to estimate the probability of countries to trade. (Heckman (1979.) Wagner, Head, and Ries (2002) is the only study in Table 2 where a Heckman procedure is used. Helpman et al. (2008) have recently proposed a theoretical model that yields a generalized gravity equation that accounts for self-selection into export markets, and have suggested estimating the gravity equation with a correction for the probability of countries to trade.

Another approach that is capable of dealing with zero trade is the Poisson Pseudo-Maximum Likelihood (PPML) estimator suggested by Silva and Tenreyno (2006). They propose estimating the gravity equation directly from its non-linear form by using an exponential regression function. This removes the need to linearise the model by taking logarithms, eliminating the problem of zero trade.

### 5. Methodology

Our approach, like previous econometric tests of the effect of migration on trade, is based on a gravity model of trade. Let  $m_i$  be the value of New Zealand's imports from country i (or New Zealand's exports to country i). If we define the product of the economic mass of countries i and j,  $E_iE_j$  in equation (3), as the GDP of country i multiplied by New Zealand GDP as a fraction of world GDP, and denote it  $Y_i$ , we can rewrite equation (3) as

$$\ln m_i = \beta_0 + \beta_Y \ln(Y_i) + \beta_3 \ln D_i, \tag{4}$$

where  $D_i$  is the distance between New Zealand and country *i*. As explained in Section 4, it is common to "augment" the gravity model by including factors such as oil prices, real exchange rates, common languages, common borders, membership of trade blocs, and colonial ties. If we let  $X_i$  denote all such factors, together with  $lnD_i$  and  $lnY_i$ , equation (4) can be expressed as

$$\ln m_i = \beta_0 + \mathbf{X}_i \boldsymbol{\beta}. \tag{5}$$

For studies of migration and trade, the key variable in  $\mathbf{X}_i$  is one measuring the number of migrants from each potential trading partner living in the country of interest. We also include a variable measuring the number of New Zealanders living in each potential trade partner country (our diaspora). The only other study we are aware of that has attempted to include such a variable is one on overseas Chinese (Rauch and Trindade, 2002).

#### 5.1. Unobserved heterogeneity

The variables available to us cannot capture all influences on New Zealand's trade. In other words, there is likely to be unobserved heterogeneity across our sample. Applying ordinary cross-sectional techniques in the presence of unobserved heterogeneity can lead to incorrect standard errors and biased coefficient estimates.

Use of panel data, however, permits models of the form

$$\ln m_{it} = \alpha_i + \gamma_t + \mathbf{X}_{it} \mathbf{\beta} + u_{it}, \tag{6}$$

where the subscript refers to country *i* as before, *t* refers to year *t*,  $\alpha_i$  is an unobserved countryspecific effect that represents the permanent cross-country heterogeneity,  $\gamma_i$  captures yearspecific effects, and  $u_{ii}$  is a time-varying idiosyncratic error.

If the  $\alpha_i$  are assumed to be uncorrelated with the explanatory variables, then Equation (6) can be estimated using a Random Effects approach. The assumption of zero correlation is, however, difficult to justify in our case. No such assumption is required under a Fixed Effects approach. Under Fixed Effects, however, it is not possible to obtain coefficients for variables that are constant over time, such as Language.

Previous econometric studies of migration and trade have used either ordinary cross-sectional techniques or Fixed Effects. There is, however, an alternative approach, referred to as Correlated Random Effects, that avoids the zero-correlation assumption and allows the inclusion of variables that are fixed over time. Under Correlated Random Effects, the correlation between the country-specific fixed effect  $\alpha_i$  and the explanatory variables is explicitly modeled using the expression

$$\alpha_i = \mathbf{X}_{i1} \boldsymbol{\lambda}_1 + \mathbf{X}_{i2} \boldsymbol{\lambda}_2 + \dots + \mathbf{X}_{iT} \boldsymbol{\lambda}_T + \eta_i$$
(7)

where the  $\lambda_i$  are vectors of "projection coefficients" and  $\eta_i$  is a true random effect that is uncorrelated with the explanatory variables. We assign the same weight to all time periods, so that

$$\lambda_1 = \lambda_2 = \dots = \lambda_T = \lambda, \qquad (8)$$

and

$$\alpha_i = T \overline{\mathbf{X}}_i \boldsymbol{\lambda} + \eta_i \,, \tag{9}$$

so that the country-specific effects are determined by *time* averages  $(\bar{\mathbf{x}}_i)$ . Substituting this expression into Equation (6) (and absorbing *T*, a constant, into  $\lambda$ ) gives

$$\log m_{it} = \gamma_t + \mathbf{X}_{it} \boldsymbol{\beta} + \mathbf{X}_i \boldsymbol{\lambda} + \eta_i + u_{it}, \qquad (10)$$

which can be estimated using Random Effects.

### 5.2. Selection bias

Equation 10 does not allow for zero trade. In practice, however, 28% of our observations for imports are zeros, as are 19% of our observations for exports. Following previous studies of migration and trade, we interpret the zeros to mean that observed trade values emerge from a two-step process. Countries in effect decide whether to trade, and then decide how much to trade (Head and Ries 1998; Dunlevy and Hutchinson 1999: fn20; Wagner, Head, and Ries 2002: 518). We adopt a Heckman (1979) selection model:

$$z_{it}^* = \gamma_i^0 + \mathbf{X}_{it} \boldsymbol{\beta}^0 + \overline{\mathbf{X}}_i \boldsymbol{\lambda}^0 + \eta_i^0 + u_{it}^0$$
(11a)

$$z_{it} = \begin{cases} 0, & z_{it}^* < 0\\ 1, & z_{it}^* \ge 0 \end{cases}$$
(11b)

$$\log m_{it} = \gamma_i^1 + \mathbf{X}_{it} \boldsymbol{\beta}^1 + \overline{\mathbf{X}}_i \lambda^1 + \eta_i^1 + u_{it}^1, \qquad z_{it} = 1$$
(12)

We assume that  $u_{ii}^{0} \sim N(0,1)$ ,  $u_{ii}^{1} \sim N(0,\sigma^{2})$  and  $\operatorname{cov}(u_{is}^{k}, u_{ii}^{k}) = 0$  where  $s \neq t$ , k = 0,1. However, we allow for the possibility that  $\operatorname{cov}(u_{ii}^{0}, u_{ii}^{1}) = \rho \neq 0$ . Equations (11a) and (11b) together make up the "selection equation," while Equation (12) is the "trade equation". We do not have 'exclusion restrictions' in our specification of the model, that is, both the selection and the trade equations have exactly the same set of regressors. Although exclusion restrictions are necessary in crosssection studies, they are not necessary, in general, in panel estimation. (Lee 2002: 163.) If  $\rho \neq 0$ , then simply using Equation (10) on the sub-sample with non-zero trade will lead to biased estimates. This is in fact often what the international literature on migration and trade has done. Where selection models have been applied, it has been in a cross-sectional rather than panel context. (The studies that estimated gravity models in the wider international trade literature applied pooled cross-section techniques even when they were using panel data.)

We carried out the estimation of Equations (11) and (12) using the statistical package LIMDEP 9.0. We treated  $\eta_i^1$  and  $\eta_i^0$  as random coefficients and applied maximum simulated likelihood

methods, fitting a random parameters probit model first, and then using the results to fit the trade equation.

Finally, following previous studies, we use the logs of migrant stocks in  $\mathbf{x}$ . In some cases, however, migrants equals zero, meaning that the log is undefined. Simply omitting these cases could potentially create a selection bias. We therefore adopted the approach used by Wagner, Head, and Ries (2002) and included a dummy variable Zero Migrants. When there was a positive number of migrants, we set Zero Migrants equal to 0. When there were no migrants we set Zero Migrants equal to 1 and set the log Migrants variable equal to 0. The Diaspora variable raised the same problem, and we applied the same solution.

# 5.3. Data

We have assembled data for a large panel of more than 190 countries on average for the years 1981 to 2006. As discussed, the reason for assembling a large panel dataset is to address problems of unobserved heterogeneity and selection bias.

Data on imports and exports come from the United Nations Statistics Division's Comtrade Database. The UN obtains estimates of New Zealand imports and exports from Statistics New Zealand. We treat the data as complete. If no trade is reported between New Zealand and a given country in a given year, we assume that the true value for that year was zero.

Estimates of the foreign-born population in New Zealand come from Statistics New Zealand and are based on data from the 1981, 1986, 1991, 1996, 2001 and 2006 Censuses. To calculate exact values for the inter-censal years it would be necessary to have data on deaths and international movements by place of birth, which are not available. Therefore, we have interpolated migrant numbers in inter-censal years. Data on short term visitor flows by country (our proxy for tourism exports) are also available from Statistics New Zealand and can be disaggregated by reason for visit. These data are annual.

Data on the New Zealand diaspora come from the Global Migrant Origin Database.<sup>6</sup> Because of the imputation method used, the original estimates in the database overstate the number of New

<sup>&</sup>lt;sup>6</sup> <u>http://www.migrationdrc.org/research/typesofmigration/global\_migrant</u>

Zealanders in countries with missing data. We have adjusted these estimates downwards, as described in the Appendix. Data are only available for (approximately) the year 2000, the time of the most recent global census round. Our Diaspora variable is thus only a proxy for the true number of expatriate New Zealanders in a country in any given year. This means that coefficients on the Diaspora variable are not directly comparable with coefficients on the migration variable. (The New Zealand census is also more accurate than most countries' censuses, so the Migrant Stock variable contains less measurement error than the Diaspora even in 2000.)

Data on language, and distance from New Zealand come from the Research Center in International Economics.<sup>7</sup> World Trade Organisation membership information is available directly from the WTO.<sup>8</sup> Most of our other important variables, such as each country's GDP and population, come from either the IMF or the UN.

<sup>&</sup>lt;sup>7</sup> http://www.cepii.fr/anglaisgraph/bdd/distances.htm

<sup>&</sup>lt;sup>8</sup> http://www.wto.org/english/thewto\_e/whatis\_e/tif\_e/org6\_e.htm

# 5.4. Variables

Table 3 summarises the variables.

| Variable name                 | Definition  |
|-------------------------------|---|
| Migrants                      | Log of the number of migrants in New Zealand from a given country   |
| Diaspora                      | Log of the number of New Zealand-born living in a given country   |
| Mass                          | A variable capturing economic mass. It is equal to the log of (NZ GDP x foreign country's GDP) / world GDP). All values are in 2006 \$NZ    |
| Population                    | Log of a foreign country's population   |
| Distance                      | Log of the distance between the foreign country's capital and Wellington  |
| Non-English                   | A dummy variable taking a value of one if English is not widely spoken<br>in the country.   |
| WTO Member                    | A dummy variable taking a value of one if the country is a member of<br>the World Trade Organisation  |
| Real Exchange Rate            | Log of the real exchange rate. Expressed so that an increase in this variable is associated with an appreciation of the New Zealand dollar. |
| Zero Migrants                 | Dummy variable taking a value of one if there are no migrants from the country  |
| Zero Diaspora                 | Dummy variable taking a value of one if there are no New Zealand-born in the country  |
| Average Migrants              | The average value over time of the Migrants variable  |
| Average Mass                  | The average value over time of the Mass variable  |
| Average Population            | The average value over time of the Population variable  |
| Average Real Exchange<br>Rate | The average value over time of the Real Exchange Rate Variable  |

Table 3 – Variables used in the models

# 6. Results

All results presented throughout this section are generated using Correlated Random Effects models. Year and country specific effects are included in all specifications. We do not, however, present the coefficients for these. We use one and two stars (\*) to denote significance at the 5% and 1% level respectively, and a dagger (†) to denote significance at the 10% level.

### 6.1. Merchandise Trade

#### **Exports**

Table 4 gives results for merchandise trade. In the selection equation for exports the estimated coefficients on Mass and Population are both positive and statistically significant at conventional levels, indicating that, all else equal, higher values for these variables imply a higher probability that trade between New Zealand and a given country takes place. As this is a probit model, however, the size of the increment in the probability depends on the country's characteristics.

The estimated coefficients on Distance, the Real Exchange Rate and the Non-English dummy are all negative and statistically significant indicating that, all else equal, New Zealand is less likely to trade with countries that are further away, have higher real exchange rates, and predominantly use a language other than English. The coefficient estimates on Migrants and Diaspora, the variables of most interest to us in this study, are both positive and significant.

In the trade equation for exports the estimated coefficients on Mass, Population, the Real Exchange Rate, and WTO Membership are positive while the estimated coefficients on Distance and the Non-English and Zero Diaspora dummies are negative. As Mass, Population, Distance, and the Real Exchange Rate are in logs the estimated coefficients associated with these variables are elasticities. The coefficient on Population of 1.1284 for example implies that, all else equal, increasing a country's Population by 1% would lead to a 1.13% increase in exports to that country.

The coefficient of 0.4030 on WTO membership implies that, all else equal, New Zealand exported on average around 40% more to members of the World Trade Organisation over the period 1981 to 2006 than it did to non members.

The estimated coefficient on Migrants implies that on average a 1% increase in the stock of migrants from a given country would result in an increase in exports to that country of around 0.06%. The Diaspora variable, however, is not statistically significant.

### **Imports**

In the selection equation for imports the estimated coefficient on Migrants suggests that increasing the number of migrants from a given country will, all else equal, increase the probability that New Zealand imports from that country. Increasing our diaspora in a particular country however does not appear to affect the probability that New Zealand imports from that country.

In the trade equation for imports the estimated coefficient on Migrants is highly significant and implies that, on average, a 1% increase in the stock of migrants from a given country would result in an increase in imports from that country of around 0.19%. The diaspora are also important for New Zealand's imports. On average, a 1% increase in our diaspora in a given country would result in an increase in imports from that country of around 0.10%.

| Variable                   | Exports   |                      | Imports             |           |
|----------------------------|-----------|----------------------|---------------------|-----------|
|                            | Selection | Trade                | Selection           | Trade     |
| Migrants                   | 0.2256**  | 0.0637*              | 0.1234*             | 0.1912**  |
|                            | (0.0397)  | (0.0253)             | (0.0507)            | (0.0266)  |
| Diaspora                   | 0.0560*   | 0.0028               | 0.0291              | 0.1028**  |
|                            | (0.0269)  | (0.0098)             | (0.0221)            | (0.0109)  |
| Mass                       | 0.2739**  | 0.6314**             | 0.2088**            | 0.6694**  |
|                            | (0.0750)  | (0.0358)             | (0.0627)            | (0.0415)  |
| Population                 | 0.8107**  | 1.1284**             | 1.1460**            | 0.1857    |
|                            | (0.3019)  | (0.1136)             | (0.3509)            | (0.1455)  |
| Distance                   | -0.7066** | -2.5961**            | -0.6570**           | -1.8830** |
|                            | (0.1537)  | (0.0495)             | (0.1317)            | (0.0550)  |
| Non-English                | -0.3866** | -0.0751 <sup>†</sup> | 0.1640*             | 0.3215**  |
|                            | (0.0965)  | (0.0405)             | (0.0794)            | (0.0467)  |
| WTO Member                 | 0.1663    | 0.4030**             | 0.1201              | 0.2973**  |
|                            | (0.1150)  | (0.0388)             | (0.0877)            | (0.0415)  |
| Real Exchange Rate         | -0.1020** | 0.0396**             | -0.0004             | 0.0981**  |
|                            | (0.0214)  | (0.0104)             | (0.0256)            | (0.0142)  |
| Zero Migrants              | 0.1308    | 0.2261**             | 0.2135 <sup>†</sup> | 0.4940**  |
|                            | (0.1035)  | (0.0711)             | (0.1258)            | (0.1380)  |
| Zero Diaspora              | -1.0742** | -0.5345**            | -0.1791*            | 0.1456*   |
|                            | (0.1049)  | (0.0589)             | (0.0905)            | (0.0709)  |
| Average Migrants           | 0.2125**  | 0.2121**             | 0.4137**            | 0.1972**  |
|                            | (0.0457)  | (0.0279)             | (0.0531)            | (0.0298)  |
| Average Mass               | 0.2343**  | 0.2710**             | 0.1120              | 0.5820**  |
|                            | (0.0851)  | (0.0394)             | (0.0712)            | (0.0445)  |
| Average Population         | -1.1671** | -1.3490**            | -1.2794**           | -0.6289** |
|                            | (0.3019)  | (0.1136)             | (0.3519)            | (0.1463)  |
| Average Real Exchange Rate | 0.0059    | -0.1180**            | 0.0115              | -0.1546** |
|                            | (0.0254)  | (0.0131)             | (0.0292)            | (0.0165)  |
| Log Likelihood             | -1093.254 | -9434.440            | -1315.687           | -8883.670 |
| Observations               | 5025      | 4076                 | 5025                | 3602      |
| Countries                  | 205       | 201                  | 205                 | 199       |

Table 4 – Merchandise trade, 1981 to 2006

### 6.2. Trade in tourism

Previous studies of the effect of migration on trade have looked exclusively at merchandise trade. In this section we examine the effect of migrants and diaspora on an important component of the international services trade: tourism.

Ideally, for our dependant variables we would like to use data on expenditure by overseas visitors in New Zealand (tourism exports) and by New Zealanders in the countries they choose to visit (tourism imports). Unfortunately, such data are only available for a small subset of countries.

Comprehensive data are, however, available on the number of overseas visitors arriving in New Zealand from each country and the numbers of New Zealanders visiting each country. Further, this data can be disaggregated by purpose of visit. We therefore use short term visitor numbers for the purpose of "tourism/holiday" to proxy for tourism export and import expenditures. Most visits to New Zealand are for tourism or similar purposes.

Results are presented in Table 5. It appears that both migrants and the diaspora have a strong positive effect on the exports and imports of tourism. Indeed the coefficient estimates for both variables in the trade equations are much higher than the corresponding results for merchandise trade. Appendix Table 1 shows similar results for total arrivals and departures.

| Variable                   | Exports              |                     | Imports   |                      |
|----------------------------|----------------------|---------------------|-----------|----------------------|
|                            | Selection            | Trade               | Selection | Trade                |
| Migrants                   | 0.0060               | 0.2252**            | 0.0433    | 0.4185**             |
|                            | (0.0383)             | (0.0070)            | (0.0342)  | (0.0080)             |
| Diaspora                   | 0.0265               | 0.1349**            | 0.0705**  | 0.2038**             |
|                            | (0.0217)             | (0.0055)            | (0.0192)  | (0.0056)             |
| Mass                       | 0.1900**             | 0.4400**            | 0.1622**  | 0.1762**             |
|                            | (0.0648)             | (0.0148)            | (0.0552)  | (0.0200)             |
| Population                 | 0.0812               | -1.0752**           | 0.7225**  | -0.3615**            |
|                            | (0.2671)             | (0.0498)            | (0.2128)  | (0.0553)             |
| Distance                   | -1.9820**            | -2.0152**           | -1.7208** | -2.0210**            |
|                            | (0.1416)             | (0.0270)            | (0.1244)  | (0.0269)             |
| Non-English                | -0.4137**            | -0.3800**           | -0.4176** | -0.3173**            |
|                            | (0.0843)             | (0.0226)            | (0.0737)  | (0.0230)             |
| WTO Member                 | 0.0663               | 0.2172**            | 0.1367*   | 0.1226**             |
|                            | (0.0833)             | (0.0203)            | (0.0688)  | (0.0195)             |
| Real Exchange Rate         | -0.0169              | 0.0122 <sup>†</sup> | -0.0232   | 0.1200**             |
|                            | (0.0185)             | (0.0064)            | (0.0197)  | (0.0062)             |
| Zero Migrants              | -0.1143              | 0.3796**            | 0.1283    | 0.7321**             |
|                            | (0.0941)             | (0.0553)            | (0.1206)  | (0.0936)             |
| Zero Diaspora              | -0.4132**            | 0.3227**            | -0.3836** | 0.6094**             |
|                            | (0.0845)             | (0.0379)            | (0.0858)  | (0.0431)             |
| Average Migrants           | 0.3041**             | 0.1264**            | 0.3668**  | -0.0176 <sup>†</sup> |
|                            | (0.0427)             | (0.0094)            | (0.0399)  | (0.0106)             |
| Average Mass               | 0.5610**             | 0.3917**            | 0.3767**  | 0.2078**             |
|                            | (0.0767)             | (0.0172)            | (0.0629)  | (0.0215)             |
| Average Population         | -0.4955 <sup>†</sup> | 0.5867**            | -1.0176** | 0.1753**             |
|                            | (0.2696)             | (0.0504)            | (0.2138)  | (0.0558)             |
| Average Real Exchange Rate | 0.0476*              | 0.0440**            | -0.0211   | -0.0790**            |
|                            | (0.0221)             | (0.0076)            | (0.0230)  | (0.0078)             |
| Log Likelihood             | -1457.830            | -5878.512           | -1595.607 | -4843.294            |
| Observations               | 5025                 | 3686                | 5025      | 3053                 |
| Countries                  | 205                  | 201                 | 205       | 194                  |

Table 5 – Trade in tourism (holiday arrivals and departures), 1981 to 2006

#### 6.3. Extensions

In this section we extend our model in several ways. Theory suggests, and empirical studies largely confirm, that the effect of migration on trade varies with the goods being traded and the countries involved. We examine this for the case of New Zealand by re-estimating our results for merchandise trade using imports excluding oil, on the grounds that imports are channelled through a few large companies, and also because petroleum products are homogeneous goods which pose fewer of the transactional difficulties that migrants are expected to alleviate. Our expectation is that the coefficients on the Migrants and Diaspora variables should be larger in the specifications excluding oil than they are in the benchmark specifications.

Results are shown in Table 6. In particular we present in this table coefficient estimates on our Migrants and Diaspora variables from the various trade equations we obtain (when we adjust either our sample or model) for easy comparison. The first row of the table (benchmark results) gives the coefficient estimates on the Migrants and Diaspora variables from Table 4. There appears evidence to suggest that migrants do indeed have a stronger effect on trade the more differentiated the goods traded are. The full set of results is available as Appendix Table 2.

| Variable            | Migrants |         | Diaspora |         |
|---------------------|----------|---------|----------|---------|
|                     | Exports  | Imports | Exports  | Imports |
| Benchmark results   | 0.064    | 0.191   | 0.003    | 0.103   |
| Excluding oil       |          | 0.266   |          | 0.128   |
| English             | 0.055    | 0.047   | 0.042    | 0.176   |
| Non-English         | 0.064    | 0.214   | 0.072    | 0.106   |
| High income         | 0.010    | 0.100   | 0.014    | 0.195   |
| Low income          | 0.069    | 0.207   | 0.007    | 0.053   |
| Diminishing returns | Yes      | No      | No       | Yes     |

| Table | 6 – 1 | Exten | sions |
|-------|-------|-------|-------|
|-------|-------|-------|-------|

As with previous studies, we also hypothesise that migrants have a stronger effect on trade when they come from a non-English-speaking country, because the migrants' language skills are then needed, and because language proxies for cultural and institutional differences from New Zealand. Similarly, our hypothesis would be that our diaspora has a stronger effect on trade when they are located in non-English speaking countries for the same reasons. We test for such effects by interacting our Migrants and Diaspora variables with our language variable.

Again results are presented in Table 6. There is evidence that migrants from (and our diaspora in) non-English speaking countries do indeed have a stronger effect on trade than their counterparts from (in) English speaking countries. In three out of four cases the estimated coefficient on the migrant variables is higher in the non-English than English case. The full set of results is available as Appendix Table 3.

We also hypothesise that migrants have a stronger effect when they come from a low-income country (having controlled for the size of the countries' GDPs), since low income proxies for cultural and institutional differences, and for difficulties in obtaining information and enforcing contracts. By the same reasoning we also expect our diaspora to have a stronger effect on trade when they are located in a low-income country. We test for this by interacting our Migrants and Diaspora variables with a low-income variable.

Table 6 shows there is evidence to suggest our hypothesis holds for migrants. In the case of our diaspora however results suggest the opposite – that our diaspora actually may have a greater effect on trade when they are located in high-income countries. We suspect, however, that this may be a statistical artefact. The diaspora variable contains much larger measurement errors for low-income countries, because of the poor quality of these countries' data on foreign born. (This problem does not affect the migrant variable, because data for all countries come from the New Zealand census.) The full set of results is available as Appendix Table 4.

We examine how the size of the number of migrants and diaspora affects the elasticity of trade with respect to migration. We do this by adding the square of our Migrants and Diaspora variables to the regressions. This is equivalent to assuming that the elasticity of trade with respect to migration declines linearly with the log of the number of migrants; that is. the idea being tested here is whether there are diminishing returns for trade as the level of migrants rises.

Table 6 shows mixed results for diminishing returns to trade from migrants and diaspora. The full set of results is available as Appendix Table 5.

Finally, we examine how the trade retarding effects of distance have changed over time. We do this by interacting each of our year effects (time dummies) with distance. Figure 1 shows how the coefficient on distance in our trade equations for merchandise trade varies between 1981 and 2006. It appears as though the effect of distance on exports has remained relatively constant over time while the negative effect of distance on imports has actually declined. It is also interesting to note that the effect of distance on imports is consistently less than exports over the entire period.



Figure 1 – The effect of distance on trade over time

## 7. Discussion

It is plausible that the international exchange of people would facilitate the international exchange of goods and services. Subjecting this idea to formal testing is, however, difficult. There are many factors, ranging from technological change to colonial links to macroeconomic conditions, that affect both migration and trade and hence obscure the causal relationship between them. In this paper, we have taken numerous measures to mitigate confounding effects from other variables. We have controlled for observable determinants of trade and migration, such as distance, by treating migration as a covariate within a gravity model of trade. (The gravity model raised technical issues of its own, because simple versions do not allow for the possibility of zero trade, which we have dealt with using a Heckman selection model.) We have controlled for unobservable, long-term determinants of trade and migration such as colonial links. We have done this by including country-specific random effects and country-specific means for explanatory variables in our models, which we estimate with data from a 26-year panel. Finally, we have controlled for any unobserved global trends, such as improvements in communications technology, that have affected trade and migration in all countries by including year-specific fixed effects.

In our benchmark specification, merchandise exports from and merchandise imports to New Zealand both have a statistically significant relationship numbers of migrants in New Zealand, and (at least for imports) with numbers of New Zealanders overseas. Migration does seem to stimulate trade. Based on our results, if New Zealand receives 10 percent more migrants from a particularly country, New Zealand's exports to that country grow by 0.6 percent, and New Zealand imports from that country grow by 1.9 percent. These estimates fall within the range obtained in overseas studies.

Our results suggest that migration stimulates imports more than exports. Some overseas studies have also found a stronger effect for imports than for exports, but others have obtained the opposite result. The variability in research findings may reflect varying success in overcoming methodological problems. It may also reflect genuine cross-country differences in the goods being imported and exported. Perhaps the types of goods that New Zealand imports involve greater information problems of the sort solved by migrants than the types of goods that New

Zealand exports. Further research on this subject would yield insights on the mechanisms through which migration affects trade. It might also provide hints on how migrants' contribution to exports could be increased.

Consistent with previous literature on migration and trade, we find that the effects of migration are more pronounced for developing countries and for differentiated (in our case, non-oil) products. These are attractive properties. The economies of developing countries have been growing faster than those of rich countries, making them valuable markets to have access to. As commentators have noted for decades, New Zealand needs to increase its ability to export differentiated products, rather than commodities.

A novel feature of our modeling is that, as well as overseas-born people in New Zealand (the Migrant variable), we include New Zealand-born people overseas (the Diaspora variable.) The estimated coefficients for the Migrant variable are typically higher than those for the Diaspora variable. Taken at face value, this implies that a one percent increase in migrants to New Zealand would have a greater impact on trade than a one percent increase in migrants from New Zealand. However, the differences may just may just be a statistical artifact of differences in the quality of the data. In contrast to the data for the Migrant variable, the data for the Diaspora variable contain substantial measurement error and refer to a single point in time. Nevertheless, even if the coefficients on Migration and Diaspora were equal, other results from our analysis would still imply that the current population of overseas-born people in New Zealand had a greater tradeenhancing effect than the current population of New Zealanders overseas. Consistent with previous studies, we find that the effect of migration is strongest when the trade partner is a developing country or a country in which English is not the dominant language. Many migrants to New Zealand come from such countries. In contrast, most migrants from New Zealand go to a small number of wealthy English-speaking countries, with a full three-quarters in Australia. The differences in geographical distribution imply that New Zealand's foreign-born residents stimulate more trade than New Zealand's diaspora.

Another innovation in our analysis is that we examine the effect of migration on tourism. We find that the effect on tourism is several times stronger than the effect on merchandise trade. Tourism is a vital industry for New Zealand, to the extent that the current Prime Minister is also

the Minister of Tourism. The strong effect for tourism is *not* an artifact of migrants being misclassified as tourists: tourism flows dwarf migration flows. Without additional data, we can only speculate on causes. It might be because migrants' country-specific knowledge of things such as food, language, and protocols are particularly important in tourism. It might also be because migrants transmit a positive image of New Zealand to their origin countries.

Finding that migration stimulates trade has implications for the design of immigration policy. A policy focused purely on skill shortages would place a high value on English-language skills and the ability to quickly fit into the host society. Whether migrants come from many countries or just a few would be irrelevant. Success would be measured by whether migrants rapidly obtained skilled employment. If migrants lived only part-time in the country, or left after a few years, this would be interpreted as a failure. During a recession, when the demand for skills no longer exceeded supply, it might be appropriate to curtail migration.

A policy focused purely only on migrants' ability to facilitate trade would apply different criteria. It would value skills in languages other than English, and an ability to operate in cultures other than New Zealand. Having migrants from a wider range of countries would be seen as a virtue, because it linked New Zealand into a larger number of overseas markets. Success would be hard to measure, because promotion of trade can take many forms, from direct involvement in an import or export business to simply raising the cultural competency of co-workers. Returning frequently to the origin country, or even eventually re-migrating, would be seen in a positive light, as helping to maintain international networks. During a recession, when international demand fell and countries erected barriers to trade, migrants' ability to operate in foreign markets would be seen as particularly valuable.

Current immigration policy in New Zealand considers a range of criteria, but focuses particularly on skills shortages. Research and media commentary do the same. The contribution of migration towards overcoming skills shortages is important. But so too is the contribution towards linking New Zealand into international markets.

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# Appendix

### **Excluding** Iraq

We excluded Iraq from our dataset after discovering that it was responsible for several large and influential outliers. Appendix Figure 1 illustrates why. After the beginning of the Iran-Iraq war in 1980, New Zealand's exports to Iraq fell sharply. They started to recover after the conclusion of hostilities in 1988, but fell again after Iraq's invasion of Kuwait in 1990 and stayed low during subsequent hostilities and trade sanctions. Imports were never more than \$NZ4 million during the period 1981-2006. However, migrants from Iraq increased steadily from the mid-1980s. The substantive significance Iraq's outlier status is that the normal migration-trade relationship does not hold in the cases of prolonged hostilities and large refugee flows. Iran and a number of African countries experiencing conflicts were generated outliers, though none as large as Iraq.

### Appendix Figure 1 - New Zealand exports to and migrants from Iraq



### Data on the diaspora

Our data on numbers of expatriate New Zealanders come from the Global Migrant Origin Database, March 2007 Update. The Global Migrant Origin Database is published by the Development Research Centre on Migration, Globalisation and Poverty at the University of Sussex (www.migrationdrc.org), and was developed in conjunction with the World Bank. The data refer to approximately the year 2000, the year of the most recent global census round. We use Version 4 of the database, which imputes values if direct estimates are not available. However, we adjust the original imputed values for New Zealand, because the standard methodology overstates the likely numbers in the New Zealand case. The original method is

based on estimates of the propensity of a country to send migrants overseas. The estimated propensity is very high for New Zealand, but this is because large numbers of New Zealanders are in Australia, and does not accurately reflect the propensity of New Zealanders to travel further afield. For instance, it produces an estimate of 1,553 New Zealanders in the Democratic Republic of the Congo, compared to 1,213 Australians. We calculated an adjusted propensity for New Zealanders to migrate by excluding New Zealanders in Australia, and used this to create new imputed values. The procedure gave more reasonable numbers: for instance, it reduced the estimated number of New Zealanders in the Republic of the Congo to 486 (which is nevertheless still implausibly high). The total number of imputed New Zealanders was 34,846 under the original method and 13,552 under our method. The total number for whom no imputation was necessary was 493,751.

# Appendix Tables

| Variable                   | Exports              |           | Imports             |           |
|----------------------------|----------------------|-----------|---------------------|-----------|
|                            | Selection            | Trade     | Selection           | Trade     |
| Migrants                   | 0.0531               | 0.1740**  | -0.0069             | 0.2689**  |
|                            | (0.0418)             | (0.0073)  | (0.0383)            | (0.0086)  |
| Diaspora                   | 0.0083               | 0.1401**  | 0.0653**            | 0.1864**  |
|                            | (0.0240)             | (0.0051)  | (0.0208)            | (0.0058)  |
| Mass                       | 0.3286**             | 0.4049**  | $0.0984^{\dagger}$  | 0.2249**  |
|                            | (0.0785)             | (0.0134)  | (0.0590)            | (0.0175)  |
| Population                 | -0.3318              | -0.6436** | 0.4569 <sup>†</sup> | -0.0626   |
|                            | (0.2896)             | (0.0470)  | (0.2352)            | (0.0506)  |
| Distance                   | -2.0809**            | -2.2030** | -1.9576**           | -2.2292** |
|                            | (0.1578)             | (0.0252)  | (0.1383)            | (0.0283)  |
| Non-English                | -0.3785**            | -0.2212** | -0.3602**           | -0.1506** |
|                            | (0.0884)             | (0.0206)  | (0.0787)            | (0.0237)  |
| WTO Member                 | 0.0113               | 0.2238**  | 0.1226 <sup>†</sup> | 0.1586**  |
|                            | (0.0967)             | (0.0176)  | (0.0707)            | (0.0196)  |
| Real Exchange Rate         | -0.0133              | 0.0326**  | -0.0532*            | 0.1214**  |
|                            | (0.0249)             | (0.0053)  | (0.0209)            | (0.0049)  |
| Zero Migrants              | -0.1844 <sup>†</sup> | 0.2517**  | 0.0384              | 0.3685**  |
|                            | (0.1001)             | (0.0543)  | (0.0992)            | (0.0747)  |
| Zero Diaspora              | -0.3754**            | 0.2299**  | -0.5406**           | 0.5525**  |
|                            | (0.0870)             | (0.0331)  | (0.0828)            | (0.0429)  |
| Average Migrants           | 0.2821**             | 0.1913**  | 0.3587**            | 0.1211**  |
|                            | (0.0468)             | (0.0093)  | (0.0428)            | (0.0110)  |
| Average Mass               | 0.3850**             | 0.3958**  | 0.4402**            | 0.2034**  |
|                            | (0.0868)             | (0.0155)  | (0.0670)            | (0.0197)  |
| Average Population         | -0.0499              | 0.1888**  | -0.7219**           | -0.1391** |
|                            | (0.2905)             | (0.0474)  | (0.2355)            | (0.0511)  |
| Average Real Exchange Rate | 0.0294               | 0.0093    | 0.0030              | -0.1187** |
|                            | (0.0284)             | (0.0066)  | (0.0239)            | (0.0067)  |
| Log Likelihood             | -1331.778            | -6064.094 | -1332.615           | -6131.113 |
| Observations               | 5025                 | 3936      | 5025                | 3458      |
| Countries                  | 205                  | 201       | 205                 | 197       |

Appendix Table 1 – Trade in tourism (total arrivals and departures), 1981 to 2006

| Variable                                    | Imports                          |                          |
|---|----------------------------------|--------------------------|
|   | Selection                        | Trade                    |
| Migrants                                    | 0.0248<br>(0.0376)               | 0.2663**<br>(0.0746)     |
| Diaspora                                    | -0.0253 <sup>†</sup><br>(0.0153) | 0.1276**<br>(0.0206)     |
| Mass  | 0.0819<br>(0.0666)               | 0.7118**<br>(0.1179)     |
| Population                                  | 0.6621**<br>(0.2402)             | 0.6504<br>(0.4007)       |
| Distance                                    | -0.5870**<br>(0.0884)            | -1.3592**<br>(0.0983)    |
| Non-English                                 | 0.2693**<br>(0.0580)             | -0.1265<br>(0.0877)      |
| WTO Member                                  | 0.4537**<br>(0.0709)             | 1.1504**<br>(0.1103)     |
| Zero Migrants                               | -0.3701**<br>(0.1007)            | 0.3830<br>(0.2865)       |
| Zero Diaspora                               | 0.0585<br>(0.0719)               | 0.2991*<br>(0.1291)      |
| Real Exchange Rate                          | 0.0043<br>(0.0288)               | 0.1551**<br>(0.0496)     |
| Average Migrants                            | 0.2266**<br>(0.0405)             | 0.2726**<br>(0.0790)     |
| Average Mass                                | 0.1576*<br>(0.0708)              | 0.3883**<br>(0.1220)     |
| Average Population                          | -0.7469**<br>(0.2401)            | -1.0205*<br>(0.4014)     |
| Average Real Exchange Rate                  | 0.0097<br>(0.0307)               | -0.1853**<br>(0.0521)    |
| Log Likelihood<br>Observations<br>Countries | -1341.668<br>5025<br>205         | -8836.355<br>3602<br>199 |

Appendix Table 2 – Merchandise trade, excluding oil, 1981 to 2006

| Variable                   | Exports             |                     | Imports             |                    |
|----------------------------|---------------------|---------------------|---------------------|--------------------|
|                            | Selection           | Trade               | Selection           | Trade              |
| Migrants                   | 0.7025**            | 0.0553 <sup>†</sup> | 0.1316*             | 0.0468             |
|                            | (0.0654)            | (0.0291)            | (0.0557)            | (0.0333)           |
| Migrants x Non-English     | -0.5816**           | 0.0086              | -0.0100             | 0.1676**           |
|                            | (0.0516)            | (0.0187)            | (0.0337)            | (0.0231)           |
| Diaspora                   | -0.4853**           | 0.0417**            | 0.0606              | 0.1755**           |
|                            | (0.0556)            | (0.0158)            | (0.0444)            | (0.0177)           |
| Diaspora x Non-English     | 0.5859**            | 0.0303 <sup>†</sup> | -0.0740             | -0.0696**          |
|                            | (0.0596)            | (0.0177)            | (0.0468)            | (0.0205)           |
| Mass                       | 0.2872**            | 0.6312**            | 0.2098**            | 0.6559**           |
|                            | (0.0729)            | (0.0359)            | (0.0631)            | (0.0420)           |
| Population                 | 0.4419              | 1.1313**            | 1.1416**            | 0.2153             |
|                            | (0.3370)            | (0.1139)            | (0.3504)            | (0.1471)           |
| Distance                   | -0.7953**           | -2.6637**           | -0.6753**           | -1.8485**          |
|                            | (0.1604)            | (0.0513)            | (0.1319)            | (0.0552)           |
| Non-English                | 0.7297**            | -0.1989*            | 0.4361**            | -0.3818**          |
|                            | (0.1470)            | (0.0820)            | (0.1312)            | (0.1059)           |
| WTO Member                 | 0.1706              | 0.3992**            | 0.1186              | 0.3000**           |
|                            | (0.1144)            | (0.0391)            | (0.0882)            | (0.0418)           |
| Real Exchange Rate         | -0.0859**           | 0.0405**            | 0.0003              | 0.0945**           |
|                            | (0.0223)            | (0.0104)            | (0.0255)            | (0.0143)           |
| Zero Migrants              | 0.1944 <sup>†</sup> | 0.2099**            | 0.2121 <sup>†</sup> | 0.4733**           |
|                            | (0.1116)            | (0.0721)            | (0.1265)            | (0.1402)           |
| Zero Diaspora              | -0.7943**           | -0.2262**           | -0.2212*            | $0.1338^{\dagger}$ |
|                            | (0.1038)            | (0.0596)            | (0.0917)            | (0.0728)           |
| Average Migrants           | 0.2324**            | 0.1946**            | 0.4004**            | 0.1887**           |
|                            | (0.0531)            | (0.0279)            | (0.0536)            | (0.0299)           |
| Average Mass               | 0.3000**            | 0.2334**            | 0.1244 <sup>†</sup> | 0.6026**           |
|                            | (0.0850)            | (0.0395)            | (0.0719)            | (0.0452)           |
| Average Population         | -0.9017**           | -1.2975**           | -1.2901**           | -0.6501**          |
|                            | (0.3358)            | (0.1139)            | (0.3513)            | (0.1478)           |
| Average Real Exchange Rate | 0.0246              | -0.1284**           | 0.0154              | -0.1506**          |
|                            | (0.0264)            | (0.0132)            | (0.0294)            | (0.0165)           |
| Log Likelihood             | -1076.388           | -9434.552           | -1315.446           | -8881.003          |
| Observations               | 5025                | 4076                | 5025                | 3602               |
| Countries                  | 205                 | 201                 | 205                 | 199                |

| Appendix Table 3 – | Allowing the ef | ffect of migration | to vary by | / language |
|--------------------|-----------------|--------------------|------------|------------|
|                    | - 0             |                    |            |            |

| Variable                   | Exports              |           | Imports             | Imports   |  |
|----------------------------|----------------------|-----------|---------------------|-----------|--|
|                            | Selection            | Trade     | Selection           | Trade     |  |
| Migrants                   | 0.3862**             | 0.0097    | -0.0329             | 0.1002**  |  |
|                            | (0.0891)             | (0.0305)  | (0.0668)            | (0.0323)  |  |
| Migrants x Low Income      | -0.1699*             | 0.0595**  | 0.1721**            | 0.1065**  |  |
|                            | (0.0829)             | (0.0193)  | (0.0486)            | (0.0213)  |  |
| Diaspora                   | -0.1333 <sup>†</sup> | 0.0136    | 0.2353**            | 0.1948**  |  |
|                            | (0.0698)             | (0.0192)  | (0.0484)            | (0.0209)  |  |
| Diaspora x Low Income      | 0.1995**             | -0.0065   | -0.2282**           | -0.1414** |  |
|                            | (0.0725)             | (0.0208)  | (0.0520)            | (0.0232)  |  |
| Mass                       | 0.2495**             | 0.6674**  | 0.2287**            | 0.6909**  |  |
|                            | (0.0780)             | (0.0361)  | (0.0696)            | (0.0423)  |  |
| Population                 | 0.7810**             | 1.1224**  | 1.1831**            | 0.2862*   |  |
|                            | (0.3016)             | (0.1149)  | (0.3540)            | (0.1454)  |  |
| Distance                   | -0.6376**            | -2.4185** | -0.7499**           | -1.8739** |  |
|                            | (0.1543)             | (0.0496)  | (0.1328)            | (0.0550)  |  |
| Non-English                | -0.4373**            | -0.0208   | 0.1333 <sup>†</sup> | 0.3623**  |  |
|                            | (0.0974)             | (0.0406)  | (0.0795)            | (0.0466)  |  |
| WTO Member                 | 0.1910               | 0.4196**  | 0.1056              | 0.3112**  |  |
|                            | (0.1176)             | (0.0388)  | (0.0877)            | (0.0416)  |  |
| Real Exchange Rate         | -0.1027**            | 0.0393**  | -0.0003             | 0.0934**  |  |
|                            | (0.0214)             | (0.0104)  | (0.0263)            | (0.0142)  |  |
| Zero Migrants              | 0.1374               | 0.2275**  | $0.2248^{\dagger}$  | 0.5165**  |  |
|                            | (0.1047)             | (0.0709)  | (0.1284)            | (0.1377)  |  |
| Zero Diaspora              | -1.2073**            | -0.5268** | -0.1831*            | -0.1972** |  |
|                            | (0.1070)             | (0.0600)  | (0.0913)            | (0.0720)  |  |
| Average Migrants           | 0.2052**             | 0.2306**  | 0.4094**            | 0.2089**  |  |
|                            | (0.0458)             | (0.0281)  | (0.0548)            | (0.0303)  |  |
| Average Mass               | 0.2665**             | 0.2611**  | 0.0991              | 0.5152**  |  |
|                            | (0.0874)             | (0.0404)  | (0.0768)            | (0.0461)  |  |
| Average Population         | -1.1589**            | -1.3867** | -1.3060**           | -0.7008** |  |
|                            | (0.3023)             | (0.1155)  | (0.3546)            | (0.1458)  |  |
| Average Real Exchange Rate | -0.0018              | -0.1258** | 0.0163              | -0.1539** |  |
|                            | (0.0254)             | (0.0130)  | (0.0299)            | (0.0164)  |  |
| Log Likelihood             | -1092.200            | -9430.565 | -1313.456           | -8880.156 |  |
| Observations               | 5025                 | 4076      | 5025                | 3602      |  |
| Countries                  | 205                  | 201       | 205                 | 199       |  |

| Appendix Table 4 – Allowing the effect of migration to vary by incom |
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| Variable                   | Exports   |                    | Imports             |                     |
|----------------------------|-----------|--------------------|---------------------|---------------------|
|                            | Selection | Trade              | Selection           | Trade               |
| Migrants                   | 0.5034**  | 0.2490**           | 0.1182              | 0.1161**            |
|                            | (0.0700)  | (0.0364)           | (0.0720)            | (0.0375)            |
| Square of Migrants         | -0.0444** | -0.0205**          | 0.0008              | 0.0076**            |
|                            | (0.0064)  | (0.0030)           | (0.0058)            | (0.0027)            |
| Diaspora                   | -0.2545** | -0.0404            | -0.1647**           | 0.3798**            |
|                            | (0.0758)  | (0.0273)           | (0.0629)            | (0.0250)            |
| Square of Diaspora         | 0.0440**  | $0.0054^{\dagger}$ | 0.0272**            | -0.0373**           |
|                            | (0.0121)  | (0.0031)           | (0.0097)            | (0.0027)            |
| Mass                       | 0.2872**  | 0.5562**           | 0.2080**            | 0.6622**            |
|                            | (0.0741)  | (0.0376)           | (0.0627)            | (0.0415)            |
| Population                 | 0.6796*   | 1.0645**           | 1.1446**            | 0.2225              |
|                            | (0.3024)  | (0.1304)           | (0.3535)            | (0.1444)            |
| Distance                   | -1.1617** | -3.0458**          | -0.7233**           | -1.8643**           |
|                            | (0.1596)  | (0.0595)           | (0.1354)            | (0.0550)            |
| Non-English                | -0.6829** | -0.1895**          | 0.3194**            | 0.0949 <sup>†</sup> |
|                            | (0.1016)  | (0.0518)           | (0.0802)            | (0.0500)            |
| WTO Member                 | 0.1454    | 0.5045**           | 0.1194              | 0.2970**            |
|                            | (0.1158)  | (0.0423)           | (0.0881)            | (0.0413)            |
| Real Exchange Rate         | -0.0879** | 0.0347**           | -0.0006             | 0.0962**            |
|                            | (0.0214)  | (0.0123)           | (0.0256)            | (0.0144)            |
| Zero Migrants              | 0.3705**  | 0.6330**           | 0.2061              | 0.4145**            |
|                            | (0.1383)  | (0.0971)           | (0.1537)            | (0.1486)            |
| Zero Diaspora              | -1.2067** | -0.4617**          | -0.3894**           | 0.4931**            |
|                            | (0.1246)  | (0.0790)           | (0.1069)            | (0.0792)            |
| Average Migrants           | 0.1745**  | 0.3018**           | 0.3965**            | 0.1966**            |
|                            | (0.0485)  | (0.0295)           | (0.0539)            | (0.0296)            |
| Average Mass               | 0.3719**  | 0.5672**           | 0.1298 <sup>†</sup> | 0.5975**            |
|                            | (0.0852)  | (0.0416)           | (0.0719)            | (0.0450)            |
| Average Population         | -1.0862** | -1.4416**          | -1.2945**           | -0.6487**           |
|                            | (0.3023)  | (0.1309)           | (0.3539)            | (0.1453)            |
| Average Real Exchange Rate | 0.0564*   | -0.0977**          | 0.0169              | -0.1715**           |
|                            | (0.0260)  | (0.0154)           | (0.0294)            | (0.0166)            |
| Log Likelihood             | -1086.875 | -9637.062          | -1315.458           | -8881.875           |
| Observations               | 5025      | 4076               | 5025                | 3602                |
| Countries                  | 205       | 201                | 205                 | 199                 |

Appendix Table 5 – Allowing elasticity to change with the number of migrants and diaspora