### How much does geography influence language variation?

John Nerbonne (University of Groningen)

## Abstract

This paper proceeds from a quantitative perspective and applies measurements of linguistic difference to obtain characterizations of the aggregate relations among varieties in entire language areas. From there it is a small step in quantitative methodology to ask how much geographic distance influences (aggregate) linguistic differences, applying a regression design. The paper goes on to contrast the degree to which a very bare concept of geography, just distance, competes with a more complicated one, involving areas or regions, in explaining the aggregate linguistic differences among language varieties. The data is taken from dialect atlases and various other collections, and the linguistic distance is measured using a variant of Levenshtein distance, which has been demonstrated to be valid with respect to dialect speakers' judgments of linguistic difference. Pure geographic distance models account for between 14% and 38% of the variation found in the data in straightforward regression designs. The alternative to pure distance models involves dialect areas, which we examine on the basis of the independently established dialect areas in Wrede's famous map of German dialect areas, adding dialect divisions as categorical independent variables to assess their explanatory value. This increases the explained variation from 32% to 45% in the German dialect dataset, indicating that geography is indeed structured more complexly than simple distances, and also that geography influences linguistic variation deeply.

# 1. Introduction

Two insights about language variation are standard and uncontroversial, first that languages may vary in many ways and second, that nearby language varieties are generally – but not always – more similar than distant ones. Dialectometry supports the measurement of linguistic similarity and its inverse, linguistic difference or distance, in various forms and therefore satisfies a prerequisite for determining the degree to which geography influences language variation, a line of investigation that is effectively closed to research traditions that shun measurement in favor of cataloguing differences. The present paper shows how dialectometry arrives at measurements and proceeding from these, how the influence of geography on language variation may be ascertained through regression designs. In addition to this, two notions of geography are contrasted, one in which the linguistic differences between varieties is compared to the geographic distance between them (including derivatives of distance such as travel time), and another, in which sites are partitioned into areas. We can measure the contribution of areas in the same sort of regression design used to gauge the influence of geographical distance, and, finally we may examine a combination of the influence of distance and areas. We close with some reflections on the ways in which we have conceptualized geography and some speculation on the effect of modern communication technology, asking whether space as we have conceptualized it here is likely to continue to be as influential in the future as it has been in the past.

#### 2. Quantitative Dialectology

Dialectometry, or quantitative dialectology, has arisen to solve several problems that existed in traditional dialectology (Goebl 1986) – in particular, the concrete problem of "non-overlapping isoglosses", or more generally, the problem of identifying geographical structures underlying the distribution of linguistic features. The crux of the dialectometric solution has been to aggregate over many linguistic features before seeking geographic interpretation. Goebl speaks suggestively here of the dialectometer "condensing" (*verdichten*) linguistic atlas data. In addition to opening new avenues in which to seek dialect areas (or dialect continua), dialectometry likewise introduces replicable procedures into the study of dialects and provides a basis on which the research may seek more abstract regularities or "laws" (Nerbonne 2009). The present essay is concerned primarily with the latter task, that of formulating more general principles in language variation.

Some simple ways of measuring language similarities are remarkably effective. Séguy (1971) simply examined the lexical realization of a set of concepts and counted how often there was agreement and how often disagreement. In later work he extended this technique by examining linguistic differences not only in word choices, but also in pronunciation, morphology and syntax.

A slightly more complex analysis is useful to gauge differences in the pronunciation of words as these are recorded in dialect atlases, i.e. in the form of phonetic transcriptions. Levenshtein distance counts both the number of substitutions needed to transform one transcription into another, as well as the numbers of insertions and deletions, always seeking the minimum number necessary (Nerbonne and Heeringa 2009). We illustrate the effect of the procedure on two Dutch pronunciations of *melk* (the word for 'milk'), namely Frisian [moolko] (Grouw) and standard Dutch [mɛlək] (Delft). On the one hand one may examine the operations needed to map one pronunciation to another:

m o o l k odelete om o l k oreplace o by εm ε l k odelete om ε l kinsert om ε l o k

Or, on the other hand, we may equivalently inspect the alignment induced by this process:

m	э	ə	1		k	ə
m	ε		1	ə	k	
	1	1		1		1

There are several advantages to using Levenshtein distance to measure the distance between transcriptions as opposed to collecting categorical features from dialect data collections (Nerbonne et al. 2010: 42–43). First, using Levenshtein distance automates a larger part of the process of analyzing dialect atlas data, obviating in particular the need for the researcher to extract categorical differences by hand. Second, we increase

the amount of data compared by nearly an order of magnitude, as we effectively compare each word at each segment position. A list of one hundred words thus typically yields about 500 segment comparisons. Third, and related to the second, using all of the segments of transcribed words means that fewer words suffice for reliable assessments of the dialect distances between sites. Typically, thirty to forty transcribed words are sufficient. Fourth, and related to the last two, the use of Levenshtein distance involves comparing *all* the segments in the data collected, and therefore a large number of segments that happen to be in words that were chosen to illustrate dialect differences This means the data that is analyzed was effectively collected in a manner closer to the sort of random data selection that is customary in corpus linguistics and generally recommended in statistical procedures. About 80% of the segments subject to analysis were collected only because they happen to occur in a word with an "interesting" segment. So 20% was selected intentionally, and 80% unintentionally.

In all of the data sets we examine below, we measure the pronunciation difference of every pair of corresponding words (phonetic transcriptions), typically about one hundred words, in each pair of sites, often thousands (of pairs of sites), in the collection using Levenshtein distance. We take the site difference then to be the average pronunciation distance per word pair, ignoring in this way the occasional cases in which data is missing. We then follow Heeringa and Nerbonne (2001) in applying a simple regression design to the aggregate distances thus assayed, using the geographic distance between sites as the independent variable and the aggregate pronunciation distances as the dependent variable.

Given that the present contribution is intended for a volume on language and space, it is worth pausing to reflect explicitly on why as simple a spatial or geographic concept as distance plays so central a role in the theorizing. To begin, let us forswear any interest in the physical properties of space, which we imagine having no influence on speech patterns or perceptions (not even in virtue of the transmission of the sound waves). But as Bloomfield (1933, Chap.3.4 et passim) notes, speakers adjust their speech regularly for their speech partners, leading him to hypothesize that linguistic habits would likely follow the lines of the densest communication. Space or geography, as we theorize about it here, is therefore a social concept interesting for the indications it suggests about where people are communicating with one another. We suppose that people are also less likely to communicate if they live further away from each other than if they live close to each other, that is, in the usual case. This is the basis for examining the relation between simple distance and linguistic similarity. We do not suppose at all that distance is the only spatial or geographic influence on the similarity of speech habits (see further), but we examine it first, as it is very basic to the influence geography has on speakers.

The above, Bloomfieldian view is adopted here for its simplicity. It may seem to imply that variation inevitably diffuses only in order to facilitate communication with others, but I do not attribute this view to Bloomfield. As we know, in fact, variation also arises as a means for a speaker to differentiate himself or herself from others, and this sort of variation also diffuses. We shall not distinguish the two different sorts of changes in speech habits, those motivated essentially by accommodation and those motivated by a wish to assert differentiation. This perspective on linguistic variation will be ignored in the rest of this essay as I do not see how it would figure in a spatial or geographic model. We pursue a second step only in the case of one data set, the German set (see below). In this second step we complicate the simple regression design by including several more independent variables, in addition to the simple distances just described, namely a series of "dummy" binary variables which take the value one ('1') whenever two sites under comparison originate from two specific, different, a priori-defined dialect areas (e.g. the Bavarian area in Germany and the Alemannic German Southwest), and zero ('0') otherwise. This procedure follows a suggestion by Shackleton (2007, 2010) and is motivated by the wish to investigate whether dialect areas independently contribute to pronunciation distance – over and above the sheer distance between the sites that would be accounted for in the simpler design.

### 3. Data and analysis

In this section we describe the data on which our analyses are based, reporting at the same time on the regression analyses seeking to explain aggregate pronunciation distance based on geographic distance. We turn to the potentially different contribution that might be made by areal distinctions in a following section.

We note here that our use of aggregate pronunciation difference (or equivalently, average differences) naturally tends to inflate the correlation coefficients reported below. If we examined the individual word pronunciations, the correlation coefficients would drop substantially. The focus on the aggregate difference has long been standard in quantitative dialectology (see the remarks on "condensing" data above), but the deeper justification for using aggregate measures is that we are interested in the properties of linguistic varieties, i.e. the overall speech habits in a community, and not merely the properties of individual words.

### 3.1. Data and distance analysis

We compare six different dialect data collections, using the same material presented in Nerbonne (2010). That paper focused on the sub-linear (normally logarithmic) growth of average phonetic distance as a function of geographic distance, while the present paper focuses on the degree to which variation is explained via geography, including geographical distance but also areal partition. Because we have published focused papers on each of the data sets we use, the descriptions below are somewhat summary; interested readers are referred to the original papers.

Alewijnse, Nerbonne, van der Veen and Manni (2007) used pronunciation data from Bantu data collected in Gabon by researchers from the *Dynamique du Langage* project (http://www.ddl.ish-lyon.cnrs.fr/) in Lyon. Since the Gabon Bantu population consisted of migratory farmers until recently, it might be expected to show a different influence of geography on linguistic variation. The data involve broad phonetic transcriptions of 160 concepts taken from 53 sampling sites. Tone was not analyzed as the Bantu experts were skeptical about how reliably it had been recorded and transcribed. The geographic locations recorded were those provided by native speaker respondents, but they should be regarded in some cases as "best guesses" considering how mobile the population has been (over long periods of time). The pronunciation differences were analyzed using the procedure sketched in Section 2 above, and these correlate moderately with logarithmic geographic distances (r = 0.469). Houtzagers, Nerbonne and Prokić (2010) obtained data on Bulgarian dialects from Prof. Vladimir Zhobov's group at the St. Clement of Ohrid's University of Sofia. The research analyzed broad phonetic transcriptions of 156 words from 197 sampling sites in Bulgaria. Palatalized consonants, which are phonemic in Bulgarian, are represented in the data, but stress is not. The pronunciation difference measurement described above was applied, where alignments were constrained to respect syllabicity, meaning that vowels were only allowed to align with vowels, and consonants only with consonants. Because of the long Ottoman occupation of Turkey (until 1872), its patterns of variation may be atypical, but the correlation of pronunciation and logarithmic geographic distance was measured at r = 0.488.

Nerbonne and Siedle (2005) obtained data from the *Deutscher Sprachatlas* in Marburg (http://www.uni-marburg.de/fb09/dsa/). The pronunciations of 186 words had been collected at 201 sampling sites for the project *Kleiner Deutscher Lautatlas*. A team of phoneticians transcribed the data narrowly; each word was transcribed twice independently and disagreements were settled in consultation so that there was consensus about the results. The pronunciation differences were measured using Levenshtein distance, where alignments were constrained as above to respect syllabicity. Logarithmic geographic distance correlates strongly with pronunciation in this data set (r = 0.566).

Kretzschmar (1994) reports on the LAMSAS (*Linguistic Atlas of the Middle and South Atlantic States*) project, conceived and carried out mainly by Hans Kurath, Guy Lowman and Raven McDavid in the 1930s and again in the 1950s and 1960s. The data is publicly available at http://hyde.park.uga.edu/lamsas/. Due to differences in fieldworker/transcriber practices, we analyze only the 826 interviews which Guy Lowman conducted in the 1930s involving 151 different response items. LAMSAS used its own transcription system, which we converted automatically to X-SAMPA for the purpose of this analysis. This analysis we conducted using a variant of the measurements above. Nerbonne (to appear) describes some aspects of the analysis in more detail, in particular the degree to which phonological structure is present. Since the area of the present U.S. has only been English speaking for the last several centuries, it may retain traces of migration disturbance in the geographic distribution of linguistic variation. We nonetheless measured a strong correlation between pronunciation and geographic distance after applying a logarithmic correction to the latter (r = 0.511).

Wieling, Heeringa and Nerbonne (2007) analyze the data of the projects *Morphologische Atlas van Nederlandse Dialecten* (MAND) and *Fonologische Atlas van Nederlandse Dialecten* (FAND) (Goeman and Taeldeman 1996). In order to avoid a potential confound due to transcription differences, Wieling et al. analyze only the data from the Netherlands, and not that of Flanders. The former included 562 linguistic items from 424 varieties. Since the Netherlands comprises only 40.000 km<sup>2</sup>, the MAND/FAND is one of the densest dialect samplings ever. The pronunciation differences were measured using the technique described above, where alignments were constrained to respected syllabicity. Pronunciation distance correlates strongly with the logarithm of geographic distance (r = 0.622).

Gooskens and Heeringa (2004) analyze the variation in 15 Norwegian versions of the fable of the International Phonetic Association, "The North Wind and the Sun", making use of material from http://www.ling.hf.ntnu.no/nos/. The material was again analyzed using the pronunciation difference measurements explained above. David

Britain (2002) urges dialectologists to examine critically the underlying conceptions of geography they emply. Interestingly from this point of view, Gooskens (2004) compares two geographic explanations of the linguistic differences, one based on "as the crow flies" distances, and another based on the (logarithmic) travel time estimates of the late nineteenth century, showing an improvement in correlation (from r = 0.41 to r = 0.54). The motivation for examining the two operationalizations was naturally that travel time is expected to be the better reflection of the chance of social contact, i.e. Bloomfield's "density of communication".

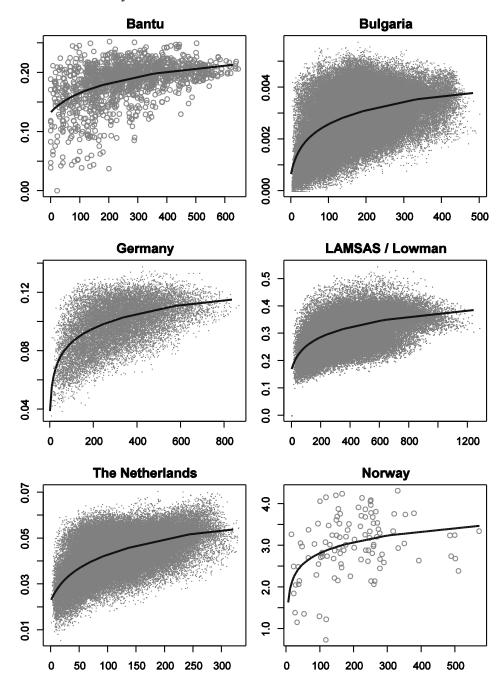


Figure 1. Pronunciation differences in Bantu, Bulgaria, Germany, the US Eastern Seaboard, Netherlands and Norway as functions of geographic difference. In each case a logarithmic regression line is drawn. Please note that the vertical *y*-axes have not been calibrated.

We conclude from this section that there is a simple and measurable influence which geographic distance exerts on aggregate linguistic differences. Figure 1 summarizes the six data sets discussed above and sketches the regression line in each case. It is an empirical finding, not a theoretical prediction, that geography accounts for 16% to about 37% of the linguistic variation in these data sets  $(100 \times r^2)$ . We note that the potential disturbances caused by migration, occupation, and recent settlement appear insubstantial enough in the cases examined so as not to disturb the overall tendency.

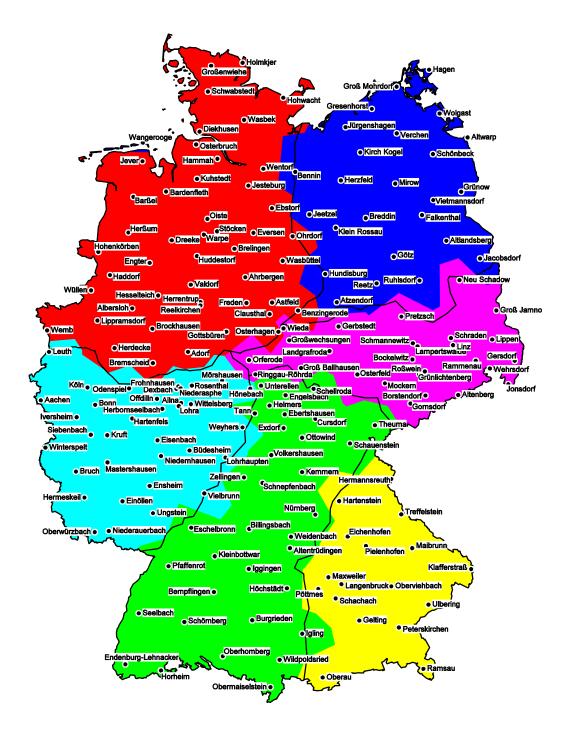
For readers of this volume who may not be as familiar with regression analyses as they would like, it is worth emphasizing some relevant, well-known facts about regression analyses in order to fend off misunderstandings. First, what counts as a "strong correlation" varies from one field of investigation to another, but many research fields use r > 0.5 as a cutoff. Second, the square of the correlation coefficient is the fraction of variance (variation) accounted for by the independent variables in the regression analysis. Given that language variation is highly complex, and that we have examined a substantial amount of it (and not merely some selected variables), one cannot expect extremely high levels of correlation (or of the derived percentage of explained variance). Third, obtaining a correlation coefficient of r = 0.6 (and thereby accounting for 36% of the variation in a data set) means that a great deal of variation is still unaccounted for, and so there is lots of work to be done. Fourth, we want to keep in mind that saying, e.g., that distance accounts for 36% of the variation in a data set does not mean that another, alternative explanation could not account for more than 64%. This is eminently possible, in particular, where distance might correlate with an alternative explanation to some degree, for example if there were a way to measure the ease of communication between settlements, or the strength of the ties that bind the communities. Fifth, we advisedly use the mean pronunciation distance between varieties as our dependent variable, and not, e.g. the pronunciation distance between the pronunciations of a particular word for the simple reason that we are interested in the entire variety spoken at a given site. As we noted above, correlations involving a mean are inevitably inflated, as they remove a significant amount of noise from the data. Statisticians have introduced the term "ecological fallacy" for steps in reasoning that infer properties of individuals (words) from the properties of aggregates (sites) (Agresti and Franklin 2009). This study is not guilty of the ecological fallacy because, as we noted at the beginning of this section (Sec. 3), we focus on the distances between entire varieties, and not on the distances of individual words. But the caution is appropriate: we can explain about 30% of the variation among varieties, but not 30% of the variation in individual words.

### 3.2. Areal Analysis

There are several reasons to look beyond distance as explicans in variationist linguistics. Reflecting on its introduction above, we recall that we were inspired by Bloomfield's (1933) notion of "density of communication". But if the density of communication influences language variation, then there is good reason to think that we might gauge this influence not only via distance but perhaps also through other phenomena that might provide some purchase on communicative density.

One such phenomenon is *dialect area*, the basis of undoubtedly the most popular visualization of geographic influence on language variation – that of dialect maps showing a partition of a language area into non-overlapping dialect areas. In Map 1 we present Wrede's division of Germany into six major areas.<sup>1</sup> Given this map it is natural to ask whether language variation is less a matter of continuous variation along the dimension of distance between sites, and rather more a matter of sites participating in a partition of relatively homogeneous areas. The quantitative perspective allows us to compare the influence of distance (see above) with that of area.

<sup>&</sup>lt;sup>1</sup> Niebaum and Macha (2006: 38) explain that Wrede's map was published posthumously in 1937 by Bernhard Martin as *Deutscher Sprachatlas*, 9<sup>th</sup> Lieferung, Karte 56.



Map 1. Wrede's (1937) atlas of German dialects has been taken here in order to use an authoritative source as a hypothesis. We shall refer to the areas (clockwise, from top left) as the northwest, the northeast, Saxony, Bavaria, the southwest, and the Palatinate. The dark lines separate Wrede's areas while the divisions in coloring depend on the automatic "tiling" done around data collection sites. There's a slight mismatch when sites practically lie on borders.

### 4. Analysis

We focus in this section on the German data, examining the effect of geographic distance through a regression design in which both bare distance but also areal

differences are used as independent variables. Naturally they are both examined for their effect on the dependent variable, linguistic distance.

In order to evaluate the influence of area quantitatively, we shall introduce variables which indicate when two sites are in two specific, different areas. For example, we shall introduce a variable "*Southwest-vs-Bavarian*" which has the value '1' if, and only if, one site in question is from the southwest in Wrede's map and the other from Bavaria. It has the value zero in every other case, i.e. when both sites are in the southwest, when they are both in Bavaria, when one site is in the southwest or Bavaria and the other is somewhere else, and also when both sites are outside of both areas. Note that there are six areas, meaning that we shall need to introduce fifteen such variables, one for each pair of areas.

Shackleton (2007: 61ff) was the first to suggest analyzing the effects of dialect areas in this way, using it to show the significance of dialect areas he obtained by clustering distance measures. Note that cluster differences are derived from linguistic distance measures, meaning that they clearly may not be regarded as statistically independent. Without criticizing Shackleton's work, let us note that some circularity may be lurking in the regression analysis that uses cluster differences. Let us therefore examine here the areal differences shown in Wrede's independently derived map. The analysis here differs only in that we have chosen *not* to use a derivative of the linguistic distance measure as its own explicans. Instead, we examine the effect of an independently proposed set of areal differences, Wrede's. Ignoring that difference, our regression analysis follows Shackleton's in technical design. The fifteen areal differences variables are added to the multiple regression design.

The comparison of bare distance versus areas as explanatory variables may be regarded as the quantitative form of the old question of whether dialects should be regarded as organized spatially as continua or as areas, i.e., discrete partitions of relatively uniform sets of sites. If the continuum view is correct, areal differences should explain nothing in models in which bare distance is included. But if on the other hand the areal view is sufficient, then the areal variables should turn out to be significant, and bare distance should play no explanatory role. Naturally there is also a "third" view which acknowledges that gradual variation is consistent with both constant rates of additional variation as well as rates that may change rather abruptly. If linguistic differences increase constantly, we obtain a perfect continuum. If, on the other hand, the rate of differentiation changes abruptly, we obtain a situation in which both the continuum and the areal views have some validity.

As we introduce such variables indicating areal difference, we nonetheless need to exercise some caution. The more areas we distinguish (and therefore the more variables we introduce), the better the chance of seeing a statistical significant effect for at least some areal differences. In the most extreme (and uninteresting) case, in which a variable were introduced for each pair of sites, the linguistic distance could be predicted perfectly. But as long as we examine only a relatively small number of areas, the question of whether bare distance or areal distinctions are the better predictors is genuine. As long as the number of areas distinguished is low, we expect to see that bare distance remains significant – at least within the large areas, which, after all, are not completely uniform.

# 5. Results

Linear distance, corrected logarithmically (see above), correlates moderately with linguistic distance (r = 0.54), thus accounting for a bit more than 29% of the variation in the data. This is slightly lower than the figure in Nerbonne and Siedle (2005), due to slight differences in measurement.

## 5.1. (Binary) areal differences

We turn then to the binary areal differences, examining each pair of differences in turn. We create fifteen pairs of models in which we examine the set of sites in two areas at a time, for example the sites in the northwest together with the sites in the north east. We then examine first just the effect of distinguishing a given pair of areas, but we also then examine the effect of including linear distance for just those pairs of sites distinguished in the areas. While all pairs turn out to predict linguistic difference to a significant degree, some are only fairly weak predictors, and significantly worse predictors than distance (the continuum model). We provide the results in Table 1 below.

	areal difference	explained areally	explained by distance		
1.	Northwest-Northeast	2.9%	17.9%		
2.	Northeast-Saxony	48.3%	47.6%		
3.	Saxony-Bavaria	51.7%	55.7%		
4.	Bavaria-Southwest	5.9%	29.4%		
5.	Southwest-Palatinate	5.5%	33.7%		
6.	Palatinate-Northwest	46.4%	29.4%		
7.	Northwest-Saxony	54.8%	42.7%		
8.	Northwest-Bavaria	51.8%	50.4%		
9.	Northwest-Southwest	51.4%	41.0%		
10	Northeast-Bavaria	67.9%	64.6%		
11	Northeast-Southwest	52.1%	56.6%		
12	Northeast-Palatinate	44.2%	53.0%		
13	Saxony-Southwest	30.0%	43.6%		
14	Saxony-Palatinate	22.7%	40.4%		
15	Bavaria-Palatinate	18.0%	39.6%		

Table 1. Explanatory strength of areal distinctions. The central columns shows the amount of pronunciation variation explained by a given binary areal distinction; the rightmost column the amount explained by distance.

We should add that our measurements cannot be interpreted to mean, e.g., that there is no Bavaria-southwest distinction (Table 1, line 4), but only that Wrede's border is not a worthwhile distinction to be drawn for this dataset, which, of course, was collected nearly a century after Wrede's. This conclusion also assumes that we are examining the sites together with the distances between them, and that we are focusing on the question of whether Wrede's border should also be drawn to partition the set of sites in the south of Germany. Other researchers are free to attempt to show that another border distinguishing the west and the east in the south is a a more explanatory one. Unless they draw the border in a very different fashion, they are unlikely to be successful in this endeavor of course, as they can only obtain different results to the degree that they distinguish sites differently from the way we have here. We return to a further discussion of this issue at the end of this section.

If we restrict our attention to areas sharing a border (lines 1-7, 13-14 in Table 1; compare Wrede's map in Map 1) then we see that the northeast-Saxon border is slightly more predictive than distance (line 2), and that the border between the northwest and the more southern areas are massively explanatory (lines 6-7). No improvement in explained variation is associated with either the east-west border in the north, nor with any of the borders in the south.

Since this is a paper on methods in dialectology, and not on German dialectology in particular, we shall not pursue the potentially shocking conclusion here that, assuming continuum effects due to geographic distance, there are really only two important German dialect areas: the north (Plattdeutsch) involving the northeast and northwest on the one hand, and the south on the other, including all the others (Saxony, Bavaria, the southwest and the Palatinate). What might be shocking to the Germanist is not that we detect traces of this major division, nor even that it appears to be the most significant division, but rather that other areas explain rather little variation. To draw that conclusion with confidence we should need to examine a range of perturbations of Wrede's partition of sites, but the conclusion is definitely suggested by Table 1, where the only distinctions that explain much variation involve areas from either side of the north-south dividing line. All the other areal divisions either explain less than distance alone, or only marginally more. If we assume, as seems reasonable, that distance is the more primary notion of geography (compared to area), and then ask what further notions are explanatory, then only some of Wrede's areas would cross the threshold of utility in explanation.

### 5.2. Combined models

If we ignore linear distance but include all the binary areal differences, then we find a somewhat stronger correlation (r = 0.58) than we did for distance alone (r = 0.54), accounting for 33.8% of the variation in the data. This difference is statistically significant due to the large number of site pairs involved (20,100 pairs involving the 201 sites), but we shall not dwell on that.

It is a surprising result that the 15 binary variables together explain more of the variation than the simple distance, vindicating the traditional view in German dialectology, which is visualized in Wrede's map, that dialectal space is not a continuum, but rather influences pronunciations discretely, in virtue of the individual sub-spaces (areas) to which sites belong. We also note that not every areal distinction influences linguistic differences significantly in this large model. In particular, Wrede's distinction between the northwest and the northeast correlates only insignificantly with linguistic differences ( $p \approx 0.36$ ), as does the distinction between the Palatinate and the southwest ( $p \approx 0.24$ ), while the distinction between the southwest and Bavarian is only borderline significant ( $p \approx 0.044$ ). Given our examination of the pairs of areas above, these results showing insignificance are hardly surprising.

We also have the option of examining models which combine linear distance and areal differences, however, and here we see that the traditional view, which we vindicated above, was also incomplete. Taken together, the two notions of geography correlate much more strongly with geography (r = 0.69), accounting therefore for 47.2% of the aggregate pronunciation variation in the data. It is straightforward to interpret this result as indicating that a good deal of variation is not explained by areal differences, and that some continuum effects persist even with fifteen binary areal distinctions.

### 6. Conclusions

The focus of this paper has been the demonstration that quantitative dialectology may contribute new perspectives to discussions of how language variation and space interact.

First, we may calculate a measure of the degree to which language variation depends on space – this is the percentage of explained variance in regression models such as those presented above.

Second, quantitative dialectology is neutral with respect to the geographical notions brought to the table, assuming that they may be incorporated into regression models. This paper has demonstrated how two different conceptions of geography – linear distance on the one hand versus areal divisions on the other – may be compared in a quantitative fashion. It is clear that the division into geographic areas is only one of the organizing geographic concepts that might be evaluated quantitatively. A second candidate might be political borders, e.g. the case of the U.S.-Canadian border, which Boberg (2000) has argued to define a linguistic barrier. A third might be the radially shaped diffusion from centers of population, trade or government, which are related to the existence of dispersed "relic areas" (Chambers and Trudgill 1998: 94,119). Other candidates are the "staggered" patterns (Niebaum and Macha 2006: 105) of distributions resulting from diffusions of similar, but not identical dynamics, or perhaps the ribbon-shaped diffusion along important trade and travel routes. Some such patterns will not be analyzed successfully without some clever additions to the methodology I have sketched above, since it is not always clear how to characterize these structures in a way amenable to quantitative analysis, but the effort will be worthwhile.

Third, we have not just suggested the feasibility of mixed forms of geographic influence, but more importantly we have demonstrated that geography in fact is influential in a mixed form, involving both distance and area in a very well studied language area such as Germany.

### 7. Reflections on Geography

In all of what is written above, *geography* – whether geographic distance or as the basis of an areal division among varieties - certainly should not be understood as a physical influence on language variation, but rather as a useful reification of the chance of social contact. Accordingly, we regard space as something which promotes or discourages social contact, and which does so by virtue first of the distances which settlements may be from one another, and second, by the regions which settlements may co-occupy (or fail to co-occupy). With respect to the first, we note that a space which defines travel times, rather than kilometers of remoteness of positions, may function better than space as it is normally conceived, as the temporal notion influences the chance of social contact even more directly than the geographical notion. Recall Gooskens (2004), discussed above. With respect to the second, we hypothesize that regions are influential to the degree to which they represent relatively closed social networks. In speculating this way I do not mean to suggest that the borders of the German areas sketched by Wrede were ever impermeable for the purposes of communication, only that communication tended to involve people within a single area more than people from two different areas. This, at any rate, would be the Bloomfieldian line.

Space proves to be massively influential from this perspective, but one should not imagine that its influence is inescapable. Where modern, interactive means of communication support intimate, extended exchange, where interlocutors have the opportunity to appreciate not only what each other is saying, but also how it is being said, and where occasionally adopting one another's speech habits can be appreciated, one might expect such interactions to influence patterns of language variation, at least in the short term. In this case one might also expect notions like the difficulty of communicative interaction to play a role in predicting linguistic dissimilarity much like that now played by physical remoteness. But let us note at the same time that communities that are defined by occasional communication (lots of blogging, net lists, twitter, etc.), and which are difficult to gauge with respect to their language variety might be characterized by changes that reflect brief accommodation (linguistic registers) rather than by longer term changes in language habits. The jury is still out on whether the newest generation of communication technology will influence language variation more permanently.

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