

Lexis fields

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Abstract

Background Lexis surfaces are an established visualization technique to show how a given value changes over age and time. Vector fields are a 2d or 3d representation of flow variables such as direction and speed (or force).

Objective We aim to increase the information density of patterns shown on the Lexis surface by placing a vector field on the Lexis surface.

Results We show Lexis fields using different combinations of visual encodings, such as color, contour layering, and angle, length, and thickness of field elements. These instruments enable information layering that is not common practice on standard Lexis surfaces.

Conclusions Lexis fields extend the analytic power of the Lexis surface, and these can be rendered to display information at higher densities than standard Lexis surfaces.

Introduction

Lexis surfaces are a graphical tool used to display data on the Lexis coordinate plane, a Cartesian plane that is also a simplex relationship between age, period, and cohort. Surfaces are often displayed as heat maps, contour maps, perspective plots, or variants of these things. Various kinds of quantities, such as raw magnitudes, differences, ratios, intensities, proportions, derivatives, and even compositions (Schöley and Willekens 2017) can be displayed on Lexis surfaces in order to put age, period, cohort, or other patterns in relief.

Maps in general combine layers of categorical, continuous, and symbolic information on a common spatial projection. Lexis surfaces in contrast almost exclusively display one visual layer at a time. Even the composite surfaces of Schöley and Willekens (2017), which display layered information are rendered as a single visual layer. Small multiples of Lexis surfaces (for example panel plots of Lexis surfaces) on the other hand constitute a de-layering, as these are spatially disjoint, and this makes comparisons laborious for the viewer. We propose to enrich Lexis surfaces by adding a visual layer of quantitative information coded symbolically as a vector field, and we liken this to cartographic information layering.

Vector fields are a graphical form generally used to display variation in speed, direction, or force over a plane. Point estimates of these quantities on the plane are often represented with segments or arrows, where length may be proportional to a function of magnitude (force, speed), and angle indicates direction, potentially disambiguated with an arrowhead or articulated as a curve. We propose a fusion of Lexis surfaces and vector fields, *Lexis fields*, as a tool to display variation in relationships between variables over age and time. A Lexis field may either be rendered atop on a Lexis surface, representing two map layers — a true Lexis map — or as a single-layer stand-alone visualization.

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39 We give an overview of constructing a Lexis field with an application. Our example explores the relation-
40 ship between remaining life expectancy and the standard deviation of remaining lifespan over age and time
41 based on all available populations in the Human Mortality Database from 1950 onward. Other potential
42 applications are discussed.

43 1 Lexis field construction

44 It makes sense to plot a Lexis field if data contain a relationship that can be summarized with a line, a
45 simple curve, or similar, that varies by age and/or time. Constructing a Lexis field involves several degrees
46 of designer freedom, which can however be codified into four basic steps, which we summarize in Fig. 1. The
47 steps to do so are outlined in the following steps, referenced to regions of Fig. 1.

48 **A** Determine the Lexis reference grid size for data selection. For example, a five-year grid implies 5×5
49 Lexis cells. Data may be selected from multiple populations on the same reference grid or may consist in a
50 selection of attributes from a single underlying Lexis surface. Presumably two variables are required.

51 **B** Abstract a model from the data, such as a linear, parabolic, or similarly simple relationship. We consider
52 the case of a bivariate linear model that produces a result of the form $y = a + b * x$. An example of a nonlinear
53 relationship is discussed.

54 **C** Translate the model fit to the characteristics of a line segment, or field *pointer*. Treat each grid cell on
55 the Lexis diagram as a plot area, by default with equal year units in x and y , for example as implied by a 5×5
56 cell. In our implementation, the pointer always passes through the centroid of the Lexis cell. The pointer
57 angle or slope may be taken as-is from a linear model, or exaggerated by the same multiplier for the entire
58 field to increase definition. Within the Lexis cell a circle tangent to the four cell borders standardizes the
59 length of the pointer, where the radius of the standard circle can be adjusted by defining an inner margin
60 width (pad) to the Lexis cell. In the simplest case, all pointers may be of the same length, irrespective of
61 slope, as determined by this reference circle. Otherwise, length may be proportional to some other data or
62 model characteristic, such as the observed range of x , the goodness of model fit, or similar. Likewise, other
63 segments characteristics, such as color, or width, may also map to data characteristics.

64 **D** Render the segment in the corresponding Lexis grid cell, repeating all steps for each cell in the diagram.
65 Variations in pointer aesthetics over the Lexis plane may reveal macro-demographic patterns.

66 2 Application

67 We select all HMD data available for females after 1950. For each lifetable we calculate two additional
68 columns: the standard deviation of remaining lifespan $sd(x)$, and the coefficient of variation of remaining
69 lifespan $CV(x)$. Each Lexis field element is based on the relationship between $sd(x)$ and remaining life
70 expectancy $e(x)$ in 1×5 Lexis cells¹, as summarized by bivariate linear regression over the data points in each
71 cell. The regression results used for each Lexis cell in resulting Lexis fields are identical, but the translation
72 of regressions to field pointers varies between designs. We offer four examples of Lexis field designs, displayed
73 in Fig. 2, each rendered on 5×5 Lexis subplots.

74 The first of these, Fig. 2a, is a bare-bones Lexis field that serves to illustrate the underlying concept. This
75 display renders each regression slope as a line segment of equal length (4 “years” long) and centered on each
76 Lexis cell. The slope of each pointer is rendered identical to regression slopes, which may be justified in this

¹Data points included in regressions are single ages evenly divisible by five for each of the five years included in a Lexis reference cell.

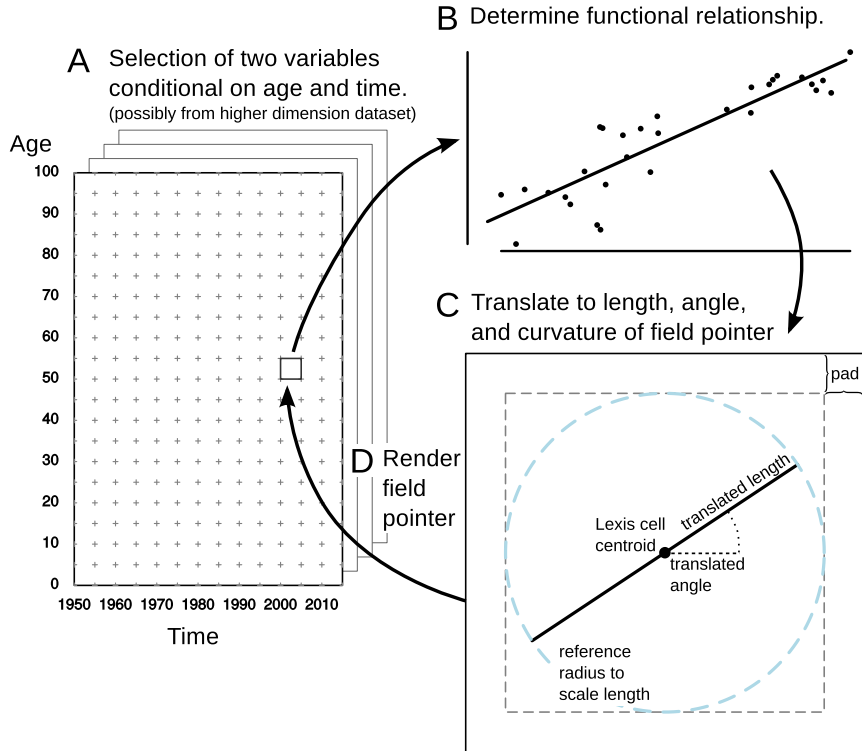


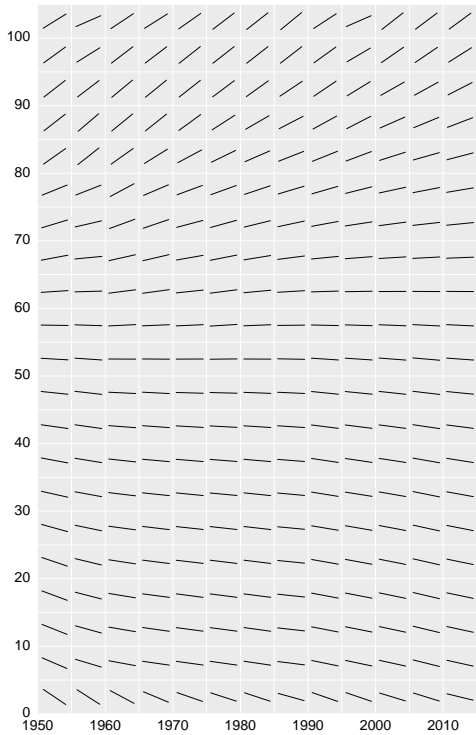
Figure 1: A diagram depicting the translation of functional relationships in data conditioned on age and time to visual encoding on a Lexis field. **A**: Condition data selection on age and time. **B**: model the functional relationship in data subset. **C**: Translate the model to field elements, ‘pointers’, using angle, and possibly also length, curvature, thickness, etc to encode model qualities. **D**: Populate the Lexis plane with field pointers to create a Lexis field.

77 case, since Lexis cells fix a 1:1 year aspect ratio, while $e(x)$ and $sd(x)$ are also in year units. This is the truest
 78 and most literal depiction of how these regression slopes vary over age and time among HMD females, and
 79 nothing more. From this figure we can see, for example, that there is some age where the relationship turns
 80 from negative to positive, which increased slightly over time. Slopes dampened in younger ages around the
 81 1980s, but have since increased (except infants).

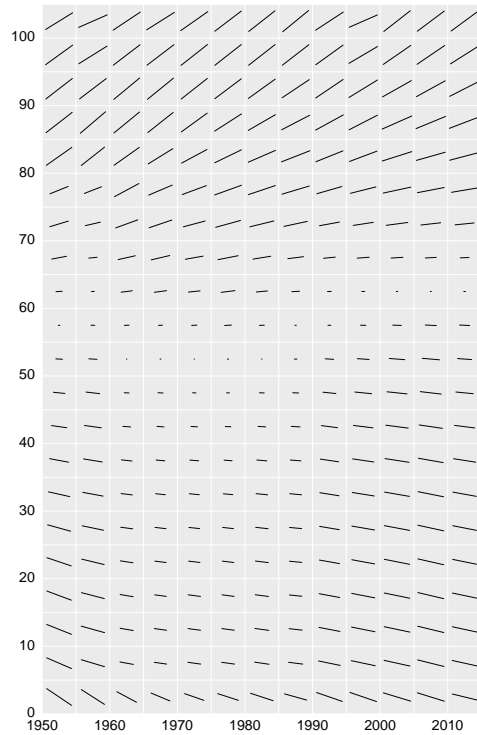
82 The second version, Fig. 2b, also renders slopes on a unity aspect ratio, but lengths are proportional to
 83 the Pearson’ correlation coefficient’s r . Other measures of model fit could be used to similar effect to scale
 84 some characteristic of the field pointers. For example, Fig. 2c renders slopes multiplied by two, with pointer
 85 lengths scaled proportional to the between-population interquartile range of the $e(x)$ and $sd(x)$ values used
 86 in regressions²., and line weight and grayscale “proportional” to the r^2 of the regression fit. Segment lengths
 87 are therefore indicative of the spread in the data, while higher Pearson’s r results in more contrast in the
 88 field.

89 The final example, Fig. 2d is a true Lexis map. The base of the map is a filled contour plot of the mean
 90 (over HMD populations) coefficient of variation of the conditional remaining distribution $CV(x)$ in each
 91 single age and year. This map is redundantly coded with a sequential color palette and labelled contours,
 92 which liberates the surface from an explicit color legend. The same field from Fig. 2c is layered atop the
 93 CV surface, achieving a true layered map. In principle, one could represent variation in the slope of some
 94 other regression over age and time as a contour plot, with the present field atop, thereby layering comparable
 95 information. However, the present example serves to illustrate layering with the field.

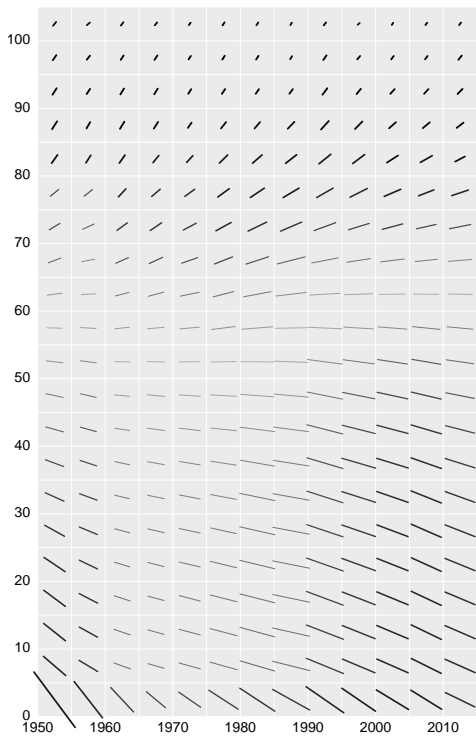
²Specifically, pointer length is proportional to the central spread of the relationship between $e(x)$ and $sd(x)$, approximated as $\sqrt{IQR(e(x))^2 + IQR(sd(x))^2}$



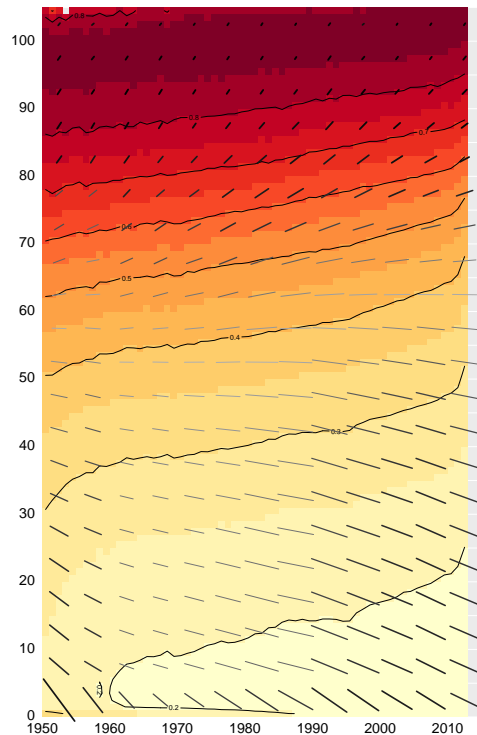
(a) Lexis field: $sd(x)$ by $e(x)$ linear fits, with slopes drawn directly. Pointer lengths are all equal.



(b) Lexis field: $sd(x)$ by $e(x)$ linear fits, with slopes drawn directly. Pointer length is proportional to the Pearson's r .



(c) Lexis field: $sd(x)$ by $e(x)$ linear fits, with slopes exaggerated by 2. Pointer length is proportional to the diagonal of the IQR box around $sd(x)$ and $e(x)$, while grayscale and segment width are proportional to Pearson's r .



(d) A Lexis map: Lexis surface of mean CV as a filled contour plot plus a Lexis field of $sd(x)$ by $e(x)$ linear fits, slopes exaggerated by 2. Pointer length is proportional to the diagonal of the IQR box around $sd(x)$ and $e(x)$, while grayscale and segment width are proportional to Pearson's r .

Figure 2: Four versions of Lexis fields displaying the linear relationship between the standard deviation and mean of remaining lifespan, females (HMD).

96 3 Discussion

97 We suggest the use of vector fields on the Lexis surface, introducing the notion of a Lexis field, which is a
98 standard vector field on a regular Lexis grid over age and time. We demonstrate some of the designer degrees
99 of freedom in translating data into the elements of a Lexis field, as well as an instance of Lexis map layering.
100 These examples serve to illustrate the construction of Lexis fields, but do not pretend to be “best practice”
101 Lexis surface in terms of visual design or legibility. It is our sense that the patterns revealed in Figures 2a-
102 2c are accessible to the viewer and lend themselves to substantive interpretation. This visual instrument
103 indeed arose in practice in an attempt to investigate the apparently mechanical relationship between lifespan
104 variation and average length of life with a macro view. Fig. 2d simply serves to illustrate that Lexis fields
105 can be layered with traditional Lexis surfaces that are color coded, increasing the information and pattern
106 density on the Lexis plane with little drawback in terms of legibility.

107 Although patterns in data may be much more complex than can be expressed with linear models, these
108 simple model fits can be thought of as regular samples from the complex space implied by data, such that
109 the pattern revealed on the Lexis field is still revealing. On the other hand a field may be derived from
110 a single underlying pattern rather than a series of regressions on different populations or variables. For
111 example, Shang (2018) recommends the use of derivative phase diagrams to represent the rate of change of
112 the hypothetical lifecourse implied by period fertility curves. This construct could be translated to a Lexis
113 field in a straightforward way, with pointers mapping to the notions of acceleration and velocity. Certainly
114 variants of vector fields could be used to intuitively render other demographic phenomena and components
115 of demographic change, and these do not need to adhere to the Lexis grid. Indeed, we suggest the use of
116 fields based on demographic relationships in spatial settings.

117 4 Conclusions

118 We describe the construction and use of vector fields on the Lexis plane. We argue that this technique can
119 increase the information density and scope displayed on the Lexis surface. We also argue that the visual
120 encoding of fields is easily rendered compatible with Lexis surfaces rendered as filled contour plots, which
121 lends itself to map layering. We suggest alternative visual encodings and uses. In sum, displaying a larger
122 variety of demographic quantities on the Lexis plane and increasing the information density on the Lexis plane
123 using layering techniques such as fields should broaden the scope of demographic exploration and sharpen
124 the instruments of demographic pattern detection.

125 5 Reproducibility

126 Code used to produce the experimental visualizations here is available in a github repository:

127 <https://github.com/timriffe/MacroShape>

128 6 Acknowledgements

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