Representing Multifunctional Cities: Density and Diversity in Space and Time

MICHAEL BATTY, ELENA BESUSSI, KEES MAAT, and JAN JAAP HARTS

Here we define measures of urban diversity, density and segregation using new data and software systems based on GIS. These allow us to visualize the meaning of the multifunctional city. We define various indices which show how diversity and density manifest themselves spatially. We argue that multifunctionalism is a relative concept, dependent upon the spatial and temporal scale that we use to think about the mixing and concentration of urban land uses. We present three examples using spatially smoothed indicators of diversity: for a world city – London, for a highly controlled polycentric urban region – Randstad Holland, and for a much more diffusely populated semi-urban region – Venice-Padua-Teviso. We conclude by demonstrating that urban diversity varies as people engage in different activities associated with different land uses throughout the day, as well as through the vertical, third dimension of the city.

Diversity and Density: Concentration and Segregation of Urban Functions

By all accounts, the European medieval city was a place teaming with different activities where people accomplished their daily tasks in close proximity to one another. Through economic necessity, most activities clustered close together, literally on top of one another and what segregation existed was highly ritualized through the institutionalized power of church and state. All this was changed by the Industrial Revolution. Although new populations were concentrated in factory towns, this congestion was much more uniform than hitherto. As wealth began to increase, people and activities sought more space and the heterogeneity of the city in history began to reduce.

In the twentieth century, this process has

accelerated in the quest to deconcentrate activities in the search for more living and working space. This has been made economically possible by keeping urban activities linked together through new transport technologies with lower costs. Urban sprawl has lead to less diversity and greater segregation of populations according to income while economic activities have no longer needed to be as close to one another as they have been in the past. This has led to highly specialized nodes such as edge cities appearing as a counterpart to the familiar decline of the city centre or downtown, particularly in North America (Besussi and Chin, 2003). Planning policies that sought to reduce such diversity were widely applied during the twentieth century, ranging from the segregation of pedestrians from vehicles at the urban design scale, to the movement of industries away from their traditional cores through policies such as new towns and growth poles at the regional scale.

During the last half century, there are few who have questioned this almost unwitting association of planning policy with the economic momentum towards a decentralized, dispersed urban world. Although Jane Jacobs (1961) has been a lone voice in arguing that cities should fight to be more like their medieval counterparts than the kinds of soulless, low density forms that have become the norm, the idea that cities might be once again higher density, with mostly mixed rather than segregated uses, appears to be gaining ground. The diseconomies of urban sprawl are well known but transport congestion, the need to reduce pollution, and the need for more liveable environments are all being used to argue that the multifunctional city is now a distinct reality. Given that modern economies are largely based on soft activities, on the knowledge economy, and on services rather than manufacturing or manual labour, the economic conditions appear more favourable for high density, mixed use location than at any time during the last 200 years.

In this paper, we will present techniques and examples of how we might represent such multifunctionality. We will focus on visualizing density and diversity in different types of cities, drawing on the many new data sources and ways of representing and visualizing these, using new digital software such as geographic information systems (GIS). We will begin by presenting various indicators used to measure such diversity and then illustrate how the spatial scale is important in being able to articulate the meaning of mixed use. We will make a foray into notions about how diversity varies in time, through the working day and also in the third dimension, although the three examples we will use to demonstrate how such diversity can be measured, are based on two-dimensional map representations. However, once we have presented these, we will illustrate how the 24 hour city changes our view of diversity and how the third dimension, important in very large cities, mainly in their centres, must be fundamental to extending our understanding of this concept. The indicators that we introduce are all designed to provide us first and foremost with a deeper understanding of the extent to which our cities are already multifunctional. But developing these new ways of visualizing urban structure provides us with the opportunity to use the same kinds of measure to visualize urban futures which are radically different in functional terms.

Measuring Multifunctionality through Spatial Indicators

In talking of multifunctional cities, we make the assumption that more than one activity or function exists in the same location and/or at the same time, which only strictly holds if we consider a neighbourhood or time interval in which these activities exist together. We will examine this in more detail later but for now, it is clear from our previous discussion, that multiple functions are often associated with higher densities as well as a greater range or mix of individual activities existing side by side. As densities get lower, activity is more spread out and less distinct activities exist in the same place; at high densities, many different activities can exist simultaneously simply due to their crowding. Density is usually defined as the normalized areal count of an activity; in contrast, mix can be best measured as a simple count of different activities in any one place or time.

Let us define the total number of activities or land uses as *K* and the amount of an activity *k* in a place *i* as a(i,k). The variable b(i,k) shows the existence of that variable *k* at *i*; that is if a(i,k) > 0, then b(i,j) = 1, otherwise b(i,j) = 0. The simplest measure of diversity $\delta(i)$ is a direct or raw count of the number of activities at *i*, that is $\delta(i) = \sum_k b(i,k)$ which varies from 0 where there is no activity of any kind to *K* where all the activities in the entire system exist in that place. These and all subsequent statistics might be normalized to sum to 1 or expressed as differences from their means but none of these manipulations changes their intrinsic meaning.

The diversity measure $\delta(i)$ does not take direct account of density but to create such a measure, some kind of normalization must take place to enable different amounts of the activity to be compared. One way to do this is to express the amount of activity as a proportion of its maximum, and then sum these variables across all activities which exist in each place. We call this the densitydiversity $d(i) = \sum_{k} (a(i,k)/\max_{i} a(i,k))$ which also varies over the same range from 0 to *K*. When d(i) = K, this means that in the place *i*, the volume and mix of activities is the greatest it can be with the maximum volume of each activity existing there.

It is possible to express the ratio of activity type *k* in any place as a proportion of all the activity in the region $\tilde{a}(i,k) = a(i,k)/\sum_i a(i,k)$ and to define the statistic corresponding to d(i) as $\tilde{d}(i) = \sum_k \tilde{a}(i,k)$. Using this instead of the maximum ratio gives a statistic with the same interpretation as the raw count $\delta(i)$ but in density terms. A statistic which takes this place-based density-diversity from its regional mean has been used in the Amsterdam study below as a measure of separation or segregation and this is given as

$$\bar{d}(i) \sim \sum_{k} \left| \tilde{a}(i,k) - \left(\sum_{k} a(i,k) / \sum_{ik} a(i,k) \right) \right|.$$

When this statistic is equal to 0, then the mix of activities is identical to the regional mix. This difference increases the more the place is unlike the regional mix. Many other measures of diversity might be used ranging from location quotients, shift-share measures, and entropy statistics. One of the key issues however is not so much the actual statistics used but the shapes of the distribution that occur for it is this that provides our understanding of how multifunctionality varies in space and time.

Scale and Aggregation in the Definition of Multifunctionality

Whether or not a place has more than one function - land use or activity - depends on the size of that place. If places are too small, measured at the level of centimetres, say, then no human activity can take place that is recognizable in terms of urban geography. The finest scale that we usually deal with is at the scale of the person where only a single activity can take place at any one time. As we get larger scales and spaces, more and more activities that differ can take place. When we aggregate everything to one space - the level of the region, say - all the functions that can take place do take place there. The finest-scale places we will consider here are at the level of postcode geography which in the UK and Holland represent, on average, cells or polygons of about 50 metres square. Below this we might deal with land parcels on which more than one activity can take place but at coarser scales such as blocks, block groups, and census tracts, then a much wider variety of activities is possible.

As we aggregate some places in suburban areas, these remain homogenous while other areas, particularly city centres, become more heterogeneous. What spatial analysis teaches us is that multifunctionality is a relative concept depending upon the way we define space, and its spatial variation will depend intrinsically on the scale used. We must always have in mind that wherever we examine the variation in activity a(i,k), there is another level of activity distribution at a finer spatial scale where there is no multifunctionality whatsoever. If this scale is *j*, then what we are doing is working with data which have been defined around a neighbourhood of i, Z(i), where we are aggregating the basic data from this scale to form

$$a(i,k) = \sum_{j \in Z(i)} a(j,k)$$

The usual way in which we examine



Figure 1. Housing density in Amsterdam at 250 m by 250 m (*left*); aggregated and smoothed to a 750 m x 750 m grid (*right*) (scale E–W 15 km)

patterns of multifunctionality is by smoothing the data to iron out the inevitable discontinuities that take place from data that are originally represented by land parcels and/or the fine scale postal geography. The simplest way is to take a moving average of the data which consists of averaging the data in a window or neighbourhood defined around each basic location. If the data are recorded in, say, 100 metre grid squares, then we might average the data over 300 metres where we take the 9 squares around any location *i* which we now call the neighbourhood Z(i) and form the average

$$\bar{a}(i,k) = \sum_{i \in Z(i)} a(j,k)/9$$

A more controlled method for achieving such smoothing is by using a kernel density estimator (KDE) such as the one in the proprietary GIS software *ArcView* (Mitchell, 1999). This is based on Silverman's (1986) quadratic and it is used to generate different levels of surface smoothing choosing different sizes of bandwidth – akin to different window sizes.

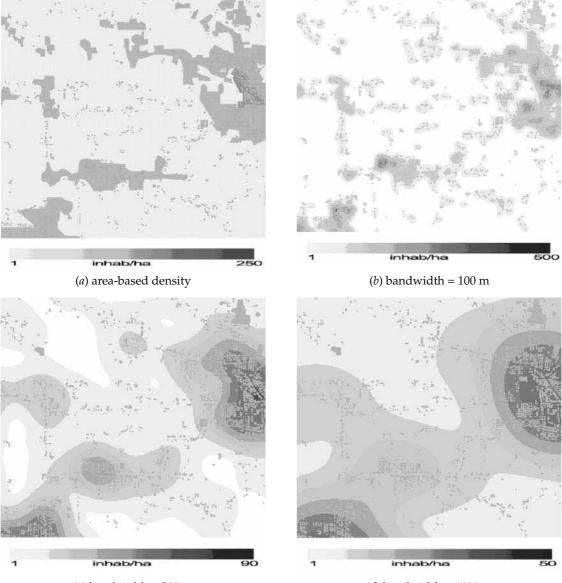
With a specific kernel function, it is the value of the bandwidth, also called the *smoothing parameter*, that determines the degree of averaging in the estimate of the density function. The possibility of 'manipulating' the results of the KDE through

BUILT ENVIRONMENT VOL 30 NO 4

the application of different bandwidths and functions can be empirically translated into testing different assumptions about the spatial behaviour of a particular variable such as its distance decay effects. In figure 1, we show some simple smoothing of density data for employment in Amsterdam while in figure 2 we show the effect of smoothing some population data for part of the Venice region using increasing bandwidths, These examples show how important it is to be clear about the effect of spatial aggregation on the interpretation of density and diversity. In the example we develop below, these kinds of function are used extensively to display and interpret spatial variations of multifunctionality. These surface modelling techniques also offer the possibility of estimating the values of a density or indicator at each location in space for which information is not available. By making assumptions on the spatial distribution of that particular variable or indicator around points of known value, such smoothing can be accomplished (Bracken and Martin, 1989; Martin, Langford et al., 2000).

Map-Based Visualizations of Multifunctionality

To illustrate how new digital data sources and state-of-the-art GIS technologies can be used



MULTIFUNCTIONAL URBAN LAND USE: A NEW PHENOMENON? A NEW PLANNING CHALLENGE?

(c) bandwidth = 500 m

(d) bandwidth = 1000 m

Figure 2. The effect of changing the smoothing parameter – bandwidth – on the display of population densities (scale E-W 5.5 km).

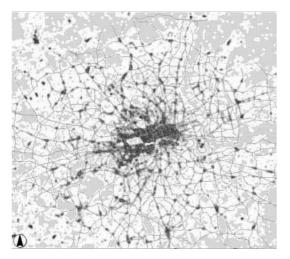
to show how contemporary urbanization reflects sprawl, decentralization from core cities, and the consequent reduction of diversity of land uses, we present three applications. Our first involves the simplest indicator of diversity $[\delta(i)]$ based on counting the number of distinctly different

employment types in each place and using the smoothing model noted above to display their spatial variation in a large world city – Greater London – whose diversity in the central core is extreme. Data are available at unit postcode level (~ 50 m resolution) for the 5 digit Standard Industrial Classification of employment from which we have taken a subset of (K =)192 types which we define as 'town centre' uses (Thurstain-Goodwin and Batty, 2001). The variations in this data based on the diversity score $[\delta(i)]$, which are available for some 300,000 locations, have been smoothed and plotted in figure 3. It is very clear that the central area of the city and its hierarchy of sub-centres are extremely diverse in comparison to the residential areas. This picture bears out our general observations that the centres of world cities are still extremely rich in functions but that the suburbs are increasingly homogeneous. One of the most useful features of using GIS technologies to display such diversity is our ability to generate surfaces which are consistent across several scales and whose variation can be examined at whatever scale is required.

In our second example, we examine two additional perspectives on diversity: first through density differences or mismatches between aggregate employment and population; second through variations in the intensities of land use which are used

to construct an index of diversity based on weighted absolute values of employment and population. The urban region is based on the cities of Venice, Padua and Teviso which is often referred to in the Italian literature as the 'diffuse city' (Indovina, Savino et al., 1990), a homogenous distribution of low density developments, punctuated by a few relatively small urban centres. This data set, unlike that of London, is based on assigning urban activity types – individual values of population and employment for the three major economic sectors (industrial, commercial-office, and service) available for built-up objects based on land parcels and building blocks - to the centroids of small census tracts. This is then used as the seed data for surface modelling, our standard technique of representation in this paper.

The mismatch between aggregate employment and population densities implies a strong separation of work from home as reflected particularly in commuter mobility patterns (Gottlieb and Lentnek, 2001). In figure 4, we compare two surfaces in the periphery of the Venice region based on density



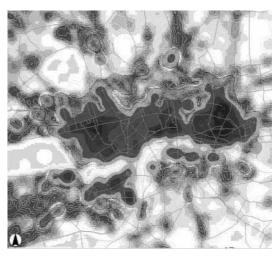
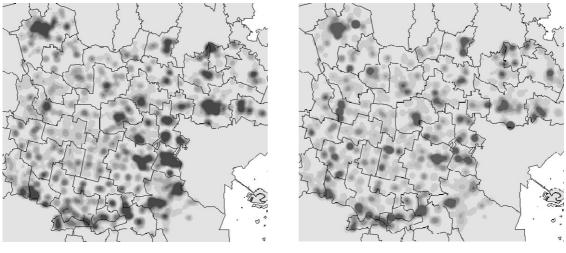


Figure 3. Spatial variation in diversity $[\delta(i)]$ in a world city: London. *Left*: Greater London showing the main town centres with diversity on a light grey (low) to dark grey (high) scale: E–W 40 km. *Right*: Central London showing the City and the West End: note the low density of Regents Park and Hyde Park: E–W 8.5 km.

MULTIFUNCTIONAL URBAN LAND USE: A NEW PHENOMENON? A NEW PLANNING CHALLENGE?



(a) Population density surface.

(*b*) Employment density surface.

Figure 4. Standardized and smoothed densities in the Venice-Padua-Teviso Region (scale E–W 40 km).

values for population a(i,1) and employment a(i,2), standardized with respect to their mean values. The spatial autocorrelation between these surfaces is immediately clear and this seems to imply that the lower the density of population, the less the number of jobs in the same place, thus reinforcing the notion that sprawl implies homogeneity and lack of diversity. To make this more explicit, we have taken three transects along the main transport routes within this region. We show these in figure 5 and these bear

out our initial impressions. These again are useful visualizations taken from GIS which indicate the power of this technology for understanding different perspectives on density and diversity. These profile graphs can be interpreted as individual 'signatures' of the functional organization of activities along those routes. In the first one (figure 5a), the profile is highly fragmented but without any significant interruption in the average density: lower levels of population densities are counterbalanced by higher

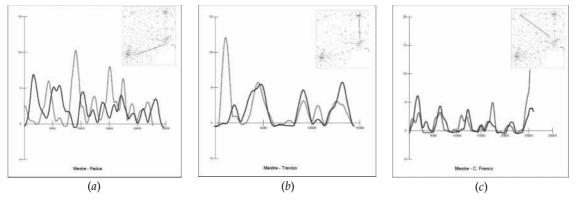


Figure 5. Density profiles based on transects between the main centres in figure 4 (the largest peaks in these figures are employment densitites, the lower population).

REPRESENTING MULTIFUNCTIONAL CITIES: DENSITY AND DIVERSITY IN SPACE AND TIME

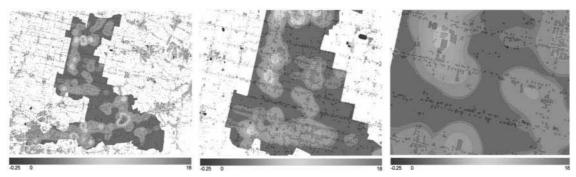


Figure 6. Density-diversity surfaces at different scales in the Venice region (scales left to right E–W 20 km, 8 km, and 3 km).

levels of employment. Despite the continuity of the built-up areas, this transport corridor presents several 'patches' where residential uses prevail over employment activities and *vice versa*. The second and third cases (figures 5*b* and 5*c*) present average densities. However the profiles show that along these two routes, areas of high density are separated by areas of lower-than-average density, more typical of a strictly polycentric structure than of urban sprawl.

The second measure is based on the simplified index of density-diversity where we use the K = 3 employment types, $\bar{a}(i,k)$, k = 1, 2, 3 (industrial, commercial, service), giving these equal weight in definition of the index $\tilde{d}(i) = \sum_k \tilde{a}(i,k)$. This measure has been smoothed and standardized and it is shown at three different scales in figure 6. Preliminary visual interpretation reveals that the main urban centres are areas of high diversity. However the effects of diversity become weaker and harder to detect away from these centres and these imply areas to which our common conception of urban sprawl would fit more closely.

Our last example is for Amsterdam. This is a core city within Holland's Randstad which has been subject to intensive planning controls for many decades. Here we will show how the indices of density and diversity based on [d(i)] and on segregation $[\tilde{d}(i)]$ can be used to show not only the spatial variation of mixed uses in the core cities, the peripheral urban region, and the 'green heart' but also the trends in mixed use over a 6-year time period. In figure 7, we show measures of density-diversity and segregation for Amsterdam where it is clear that, like central London, the centre is highly diverse. Single use specialized areas such as the docks and residential enclaves are clearly picked up by the index of segregation. This is part of a larger study which sheds light on spatial structure by examining variations and developments in dispersal of urban activities, mix of uses, density and diversity in urban areas throughout the Netherlands (Maat and Harts, 2001; Harts et al., 2002). Analyses were performed at the detailed level of 250 m for 1990 and 1996 entailing the application of grid cell and cluster analysis to four spatial databases from which typologies of urban environments were generated. In figure 8, the shift in the diversity between 1990 and 1996 is shown where it is clear that areas in the centre decline in heterogeneity while other sub-centres become more diverse.

Maat and Harts (2001) have used these measures to classify urban environments in the Netherlands into 15 different categories based on the composition of their uses. The class divisions in the typology were based on cluster analysis. This technique classifies the data in such a way that the environments are internally as homogeneous as possible and, at the same time, differ as much as possible from one another. A distinction MULTIFUNCTIONAL URBAN LAND USE: A NEW PHENOMENON? A NEW PLANNING CHALLENGE?



Figure 7. Density-diversity (right) and segregation (left) in Amsterdam 1996 (scale E–W 15 km).



Figure 8. Changes in the density-diversity between 1990 and 1996 (scale E–W 18 km) (dark to light reflects the scale of increase to decrease).

was drawn between urban and rural areas; then urban areas were further classified into urban environments. The developments were analysed by comparing the trends of 1990 with those of 1996. To create a comparable typology for 1990, the classification criteria (based on the boundaries for each variable) of the 1996 typology were applied to the 1990 variables.

Urban environments account for 13 per cent of the surface area of the Netherlands. Using the cluster analyses, the urban space was classified into 15 environments grouped here in the following classes. Centre environ*ments* are characterized by a relatively high proportion of employment location and shopping. Differences in density, multi-storey building, the proportion of non-daily shopping and types of services determine whether the centre environment is strongly, moderately or weakly urbanized. Concentrations of services, which are not usually located in traditional town centres, are classified separately. Residential environments are, of course, characterized by residential use. The degree of urbanization differs in terms of density, the proportion of multistoreyed housing, and the mix of work and shops. Mono-environments account for a large surface area and are dominated by one specific activity, such as business estates, green space and sports facilities, or large infrastructure projects. Finally, combination environments are transition zones or mixes of different types of environment. This usually means that uses are close together: dwellings and green space, businesses and dwellings,

Table 1. The 15 urban environments in the Netherlands: extent, density, and specialization
1990–1996.

Urban Environment	Urban Area 1996 [km²]	Density Index 1990–1996 [%]	Specialization Index 1990–1996 [%]
Metropolitan centre	45	-1.5	-1.3
Urban centre	102	10.5	3.0
Weakly urbanized centre	305	1.5	3.7
Concentration of services	149	10.9	6.4
Metropolitan residential area	71	3.6	2.3
Urban residential area	123	6.0	1.7
Moderately urbanized residential area	281	9.9	3.4
Weakly urbanized residential area	863	6.8	5.7
Business estates	972	16.3	8.1
Green space and sports	1456	5.3	1.4
Infrastructure	359	3.4	10.3
Residential area and green space	321	5.6	2.4
Business and dwellings	183	6.2	-0.4
Business and green space	296	14.2	2.9
Services in countryside	444	-1.6	7.0
Total urban area	5970	7.1	2.9

businesses and green space, with the services on the periphery. An example of the changes in density-diversity and in specialization of these environments is presented in table 1. This confirms our interpretations that although suburban areas are becoming more homogeneous, the pattern is considerably more complicated when it comes to older neighbourhoods and city cores.

What this analysis shows is that the whole concept of multifunctionality and mixed use is more convoluted spatially than its discussion implies. Often the argument for or against mixed use is predicated without any basis in data and although it is generally clear that suburban sprawl is much more homogeneous than previously developed residential locations closer to the urban core, this must be set against the fact that increasing wealth leads to new opportunities for developing mixed uses. Specialization in time is also equally important; populations are now much more able to organize their working days around access to different uses and activities in time and as well as space. It is to this that we turn in concluding our brief discussion of the need for good data in generating a clear picture of how diverse our cities are becoming.

The Third and Fourth Dimensions: The Vertical City, The 24 Hour City

All our analyses to date have been restricted to the two dimensions of the map. In fact, one of the major limitations of urban analysis has been our failure to embrace the third dimension for it is very clear that by restricting our analysis to two dimensions, information about the city is grossly simplified. This is particularly the case in dense urban areas such as city centres where multiple land uses are organized into the third dimension. Indeed it is impossible to understand world cities and most cities outside Europe without engaging in an analysis of land use which is organized in the third dimension. GIS, however, is beginning to embrace representation in this third dimension. Photogrammetric techniques with computer aided architectural design are converging very rapidly with the development of 3D-GIS. What is needed is the parallel development of an urban geography of the third dimension before the spatial functionality of two-dimensional GIS can be extended accordingly. This is an important challenge in extending indicators of the kinds we have introduced here (Batty, 2000).

Usually the kinds of data that we use to represent urban activities are not tagged to the local geometry of the city such as the land parcel but to some administrative unit such as the postcode. Land use may be linked to parcels but these kinds of data sets are poorly developed in contrast to activity data. However, these data are converging. Through address matching, it is increasingly possible to link administrative geography to physical geometry and once this is done, it is possible to associate socio-economic attribute data with land parcels, thence building blocks. In visual terms, this means that we are able to represent land use in the third dimension, and to tie different activities to each part of a building. The only way to visualize this kind of data is through 3D representation and this requires the user to be able to navigate around the scene, examining it from different perspectives. What we are able to do with this kind of representation is to query the data and to compute indices which are displayed in 3D.

We show an example of this in figure 9 where we have shaded the building blocks in the City of London according to the detailed diversity measure $[\delta(i)]$ computed at an average of 50 m resolution in this area. In short, what we have done is to smooth the index of diversity from the post code resolution, and then shade the building blocks according to this value. In this way, we ensure that the thematic surface data are clipped to render the faces of each building block, using the same data range as for the two-dimensional map. It is clear that the larger the building, the more likely there are to be many functions associated with the volume but the association of numbers of uses with greater numbers of storeys and greater volumes is never direct. In fact in many large, declining downtowns, the highest buildings may not be in use at all and thus this kind of visualization is crucial in understanding the economic health of high density cities.

Our last foray into wider forms of rep-

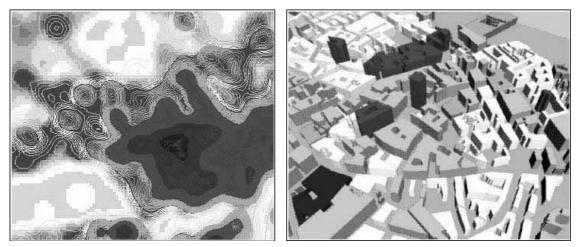


Figure 9. The index of diversity (left) mapped onto 3D building blocks in Central London (right).

resentation involves changes in multifunctionality with respect to how land uses change through real time. Although there are various seasonal and even annual cycles, the sharpest and most significant is the 24 hour day when people return from work to home (and *vice versa*) and when people spend their leisure time in specific locations such as shops or theatres or engage in other kinds of recreation. City centres, for example, have highly specialized areas devoted to shops and offices but also to offices that only open during specific times to serve the public. Entertainment is an increasingly significant function with a night-time cycle which attracts people who might never use these areas for any other function. If we map such uses, then we will see dramatic variations during the working day and in the evening, even through the night not only in terms of patronage and frequency of use on the 2D map but also in terms of the use of the vertical dimension. To give some sense of this, in figure 10 we have plotted the diversity count through time converting the index $[\delta(i,\tau)]$ to one which varies through the day $[\delta(i,\tau)]$. We show this for London's West End where we plot the surface for two

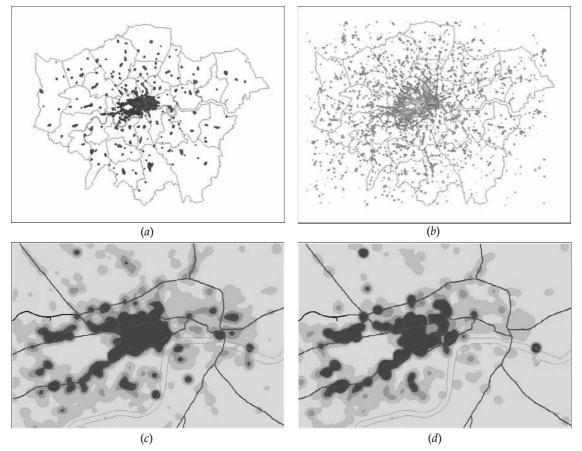


Figure 10. Classifying diversity in 24 hour city.
(*a*) London's town centres classified by night life hubs (dark).
(*b*) Night life activity based on entertainment employment.
(*c*) Diversity of the day time economy in Central London.
(*d*) Diversity of the night time economy in Central London.

points in time: during the late morning, and the mid evening. There is much more we could say about extensions of these indices through time and into the third dimension for there are many implications for the way uses and activities are scheduled and organized in urban space and time. These represent the cutting edge for others to take up but effective developments will depend on better data.

Implications for Spatial Planning

The indicators defined and applied here have been used almost entirely for measuring, thence understanding the extent to which different parts of cities at different scales generate different levels of diversity and segregation. Despite an extensive debate concerning multifunctionality in modern cities, hitherto there have been few explicit measures of its spatial incidence and hardly any sustained research into whether cities are becoming more or less multifunctional. There is a tacit assumption that urban areas are becoming less so although what our work has shown is that variations across space are substantial. For the first time, we have some sense of what the level of diversity and multifunctionality might be in different places. We now have actual measures of different places and can at least pose and tentatively answer questions like: 'is the centre of London more diverse than the centre of Venice?'.

All this suggests that the kinds of typology such as that for the Netherlands noted above which classify urban environments according to such measures, should be widely developed for multicultural and multinational comparisons. We may actually be quite surprised that what we consider to be homogeneous might turn out to be much more interesting and heterogeneous than physical appearance and form might imply. What we can do with the measures developed here is to test their sensitivity to changes in activities. For example, we can answer questions like: 'how much less diverse would central London be if all retailing were to leave the core?'. And equally well we could ask and answer questions like: 'how much more diverse would central London be if certain amounts of residential population were to occupy the centre?'.

This suggests that we could examine the functional structure of more idealized forms, for example, from the range of city shapes associated with the compact city idealizations developed by Italian Renaissance scholars to the musing of the modernists such as Frank Lloyd Wright and Le Corbusier and beyond to contemporary proposals as reflected in the New Urbanism. It is not very usual to speculate on what multifunctional cities might look like in terms of quantitative data concerning employment and related land use activities. But with good forecasting models that often lie behind the ideas developed here, it is possible to make small area predictions for future cities under different assumptions which imply a range of planning scenarios. In such cases, we should be able use the kinds of visualization that we have introduced to generate useful discussion about future cities.

Although we have focused on methods for visualization, the fact that we are able to map so many different variants of these indices also gives us the opportunity to make many contrasts between different kinds of index. We can relate these indicators to other issues of functionality and functioning, both economic and social. It would be possible to associate these with patterns of crime, deprivation, economic opportunity, local economic development potential, unemployment and so on which all correlate with multifunctionality. These are issues, however, for the future and we will conclude by returning to the immediate technical developments that our focusing on these technologies implies.

Conclusions: Next Steps

Our goal here has been to introduce readers

to some of the technical challenges in defining mixed land uses, multifunctionality, diversity and the spatial separation of activities in urban areas. GIS and related new technologies such as their extension to 3D and temporal change, provide powerful techniques for visualization essential in understanding how urban space is organized. None of us has developed these techniques in relation to projects whose sole goal is in understanding multifunctionality for this is a theme that runs through many substantive discussions of the contemporary urban scene. Our London project is largely concerned with the diversity that characterizes town centres and the surface smoothing techniques we have used have essentially been ways of mapping indicators of town centredness which are defined as the most diverse areas within the urban system.

In contrast, our work on urban sprawl in the Venice region and in the Randstad, is motivated by a concern for understanding urban growth and the separation of home from work through concepts such as wasteful commuting (Martin, 2001). Sustainable planning underlies many of these ideas but in the quest to engender greater opportunities for urban living, the idea of mixed uses is increasingly attractive. However we must be clear as to the extent to which cities are changing spontaneously towards or away from such mixing. To this end, new data of the kind we have used here are essential while the need to link the fine scale geography of the city to its geometry and the move from the 2D map to the 3D model are key issues in getting to grips with the concept of the multifunctional city.

REFERENCES

- Batty, M. (2000) The new geography of the third dimension. *Environment and Planning B*, **27**, pp. 483–484.
- Besussi, E. and Chin, N. (2003) Identifying and measuring urban sprawl, in Longley, P. and Batty, M. (eds.) *Advanced Spatial Analysis*. Redlands, CA: ESRI Press, pp. 234–278.

BUILT ENVIRONMENT VOL 30 NO 4

- Bracken, I. and Martin, D. (1989) The generation of spatial population-distributions from censuscentroid data. *Environment and Planning A*, **21**, pp. 537–543.
- Gottlieb, P.D. and Lentnek, B. (2001) Spatial mismatch is not always a central-city problem: an analysis of commuting behaviour in Cleveland, Ohio, and its suburbs. *Urban Studies*, **38**(7), pp. 1161–1186
- Harts, J.J., Maat, K. and Ottens, H. (2002) An urbanisation monitoring system for strategic planning, in Geertman, S. and Stillwell, J. (eds.) *Planning Support Systems in Practice*. Berlin: Springer Verlag, pp. 315–329.
- Indovina, F. et al. (1990) La Citta Diffusa. Venezia, Italia: DAEST.
- Jacobs J. (1961) *The Death and Life of Great American Cities*. New York: Random House.
- Maat, K. and Harts, J. J. (2001) Implications of urban development for travel demand in the Netherlands. *Transportation Research Record*, 1780, pp. 9–16.
- Martin, D. *et al.* (2000) Refining population surface models: experiments with Northern Ireland Census data. *Transactions in GIS*, 4(4), pp. 343–357.
- Martin, R.W. (2001) Spatial mismatch and costly suburban commutes: can commuting subsidies help? *Urban Studies*, **38**, pp. 1305–1318.
- Mitchell, A. (1999) *The ESRI Guide to GIS Analysis Volume 1: Geographic Patterns & Relationships.* Redlands, CA: ESRI Press.
- Silverman, B. W. (1986) *Density Estimation for Statistics and Data Analysis*. New York: Chapman and Hall.
- Thurstain-Goodwin, M. and Batty, M. (2001) The sustainable town centre, in Layard, A., Davoudi, S. and Batty, S. (eds.) *Planning for a Sustainable Future*. London: Routledge/Spon, pp. 253–268.

ACKNOWLEDGEMENTS

MB and EB wish to thank the EU who funded part of this work through the SCATTER project under the 'Energy, Environment and Sustainable Development Programme' of the 5th Framework Programme, Key Action 4: City of Tomorrow and Cultural Heritage, Contract number: EVK4-CT-2001-00063. CM and JJH acknowledge support from the Dutch Ministry of Housing, Spatial Planning and Environment (VROM).