

# Multilevel Approaches to Explore the Effect of Land Use on NHTS Commuting Outcomes

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Innovative Analysis Methods  
June 6, 2011

Using National Household Travel Survey Data for Transportation  
Decision Making: A Workshop  
Washington, DC USA

# Outline

Introduction

Review of the Literature

Data

Methodology

Analysis

Conclusions

Future Research

# Sprawl's Commuting-Related Impacts

## Negative

More vehicle miles traveled

More automobile trips

Longer travel times

## Positive

Shorter commuting times

Automobile most efficient mode of transportation

Less congestion

Source: Burchell et al. 1998

# Review of the Literature

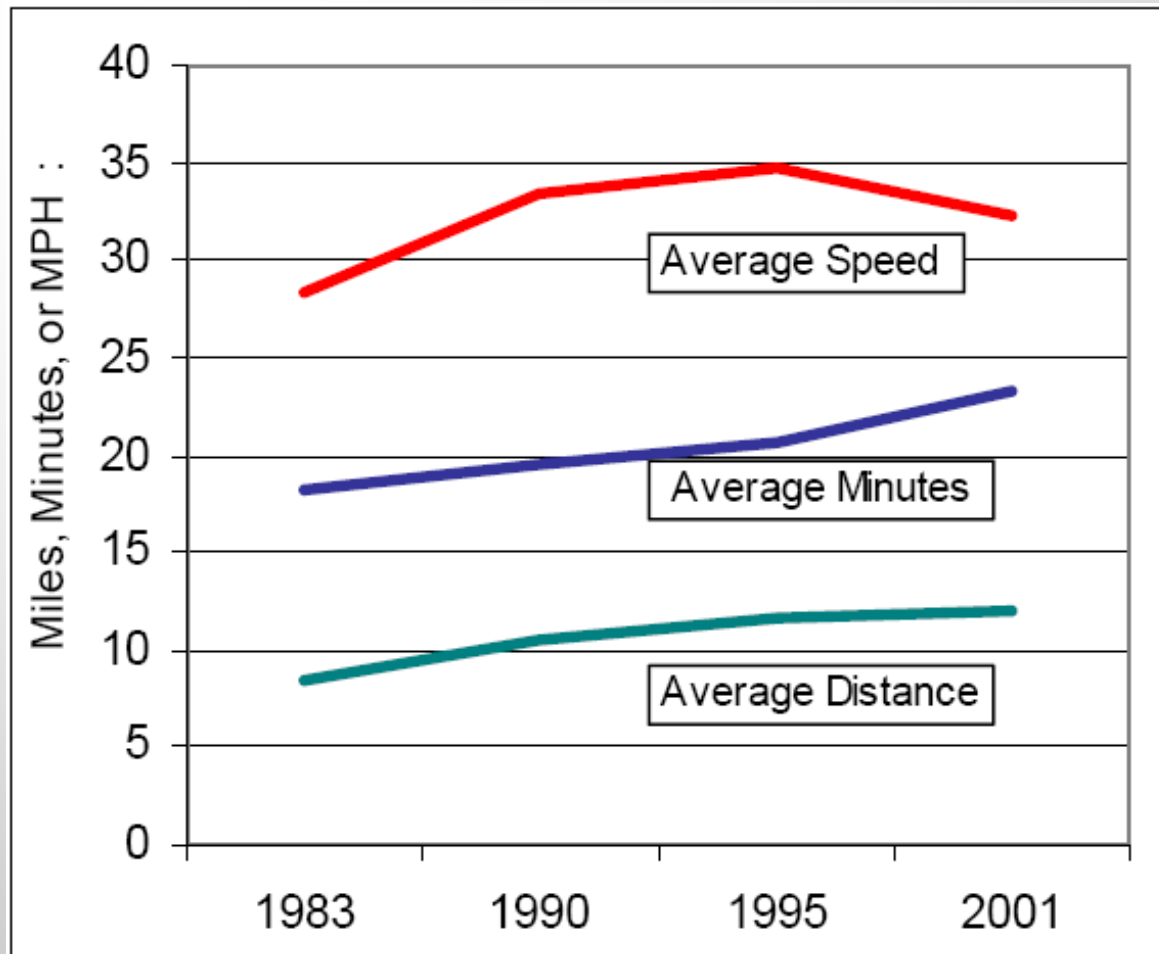
Commute times are stable...

Gordon et al. 1991  
Pisarski, 1992  
Gordon and Richardson, 1994  
Levinson and Kumar, 1994

Commute times have increased...

Rosetti and Eversole, 1993  
McGuckin and Srinivasan, 2003  
Glaeser and Kohlhase, 2004  
Reschovsky, 2004  
Levinson and Wu, 2005

# Changes in Daily Commutes, 1983-2001



# Research Questions

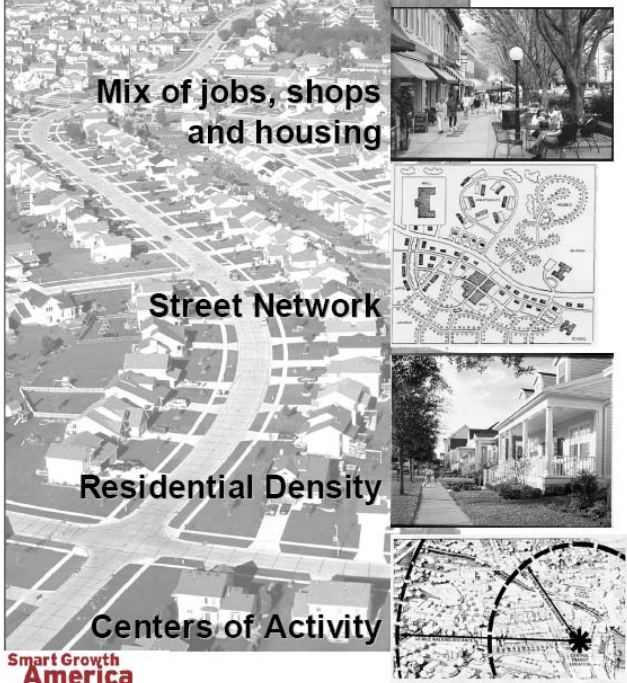
Do measures of sprawl decrease the duration of private-vehicle commutes in the United States urban system?

Do measures of sprawl increase the length of private-vehicle commutes in the United States urban system?

# Measuring Sprawl and Its Impact

**MEASURING SPRAWL  
AND ITS IMPACT**

Reid Ewing, Rutgers University, Rolf Pendall, Cornell University, Don Chen, Smart Growth America



**Mix of jobs, shops  
and housing**

**Street Network**

**Residential Density**

**Centers of Activity**

**Smart Growth  
America**  
Better Choices for Our Communities

# Sprawl

Residential Density

Land Use Mix

Degree of Centering

Street Accessibility

Source: Ewing et al. 2003



# Residential Density

The following variables were components of residential density:

- gross population density in persons per square mile;
- percentage of population living at densities less than 1,500 persons per square mile, a low suburban density;
- percentage of population living at densities greater than 12,500 persons per square mile, an urban density that begins to be transit supportive;
- estimated density at the center of the metropolitan area derived from a negative exponential density function;
- gross population density of urban lands;
- weighted average lot size in square feet for single-family dwellings;
- and
- weighted density of all population centers within a metropolitan area.

Source: Ewing et al. 2003

# Land Use Mix

The following variables were components of land use mix:

- percentage of residents with businesses or institutions within one-half block of their homes;
- percentage of residents with satisfactory neighborhood shopping within one mile;
- percentage of residents with a public elementary school within one mile;
- job-resident balance;
- population-serving job-resident balance; and
- population-serving job mix (entropy).

Source: Ewing et al. 2003

# Degree of Centering

The following variables were components of degree of centering:

- coefficient of variation of population density across census tracts (standard deviation divided by mean density);
- density gradient (rate of decline of density with distance from the center of the metropolitan area);
- percentage of metropolitan employment less than three miles from the CBD;
- percentage of metropolitan employment more than ten miles from the CBD;
- percentage of metropolitan population relating to centers of subcenters within the same MSA or PMSA; and
- ratio of weighted density of population centers within the same MSA or PMSA to the highest density center to which a metropolitan area relates.

Source: Ewing et al. 2003

# Street Accessibility

The following variables were components of street accessibility:

- approximate average block length in the urbanized portion of the metropolitan area;
- average block size in square miles; and
- percentage of small block.

Source: Ewing et al. 2003

# Multilevel Model

## Metropolitan Statistical Area

$$\pi_{0m} = \beta_{00} + \beta_{01}X_{1m} + \beta_{02}X_{2m} + \dots + \beta_{0q}X_{qm} + r_{0m}$$

## Household

$$Y_{hm} = \pi_{0m} + \pi_{1m}\alpha_{1hm} + \pi_{2m}\alpha_{2hm} + \dots + \pi_{Pm}\alpha_{Phm} + e_{hm}$$

# Data

## Household (n = 2,943)

Commute Distance  
Commute Time  
Age  
Ethnicity  
Income  
Life Cycle  
Occupation  
Sex  
Workers to Vehicles  
Vehicle Age  
Fuel Price  
Fuel Efficiency  
Vehicle Type

## Metropolitan Statistical Area (n = 44)

Congestion  
Region  
Sprawl  
Subway

# Household-Level

Y-intercept and regression coefficient estimates for households (n = 2,943).

Level	Variable	Category	Distance (Miles)	Time (Minutes)	
Household	Age	35 to 44	Referent	Referent	
		55 to 64	-1.14** (0.54)		
	Income	\$25,000 to \$49,999	Referent	Referent	
		\$50,000 to \$74,999	+1.10*** (0.60)		
		\$75,000 to \$99,999	+1.86* (0.66)	+2.71* (0.87)	
		Greater than or Equal to \$100,000	+2.16** (0.87)	+3.04** (1.38)	
	Occupation	Sales/Service	-1.27** (0.55)	-2.63* (0.79)	
		Professional/Managerial/Technical	Referent	Referent	
	Sex	Male	+3.04* (0.39)	+3.66* (0.56)	
		Female	Referent	Referent	
		Workers to Vehicles	-3.60* (0.60)	-3.62* (0.67)	
		Vehicle Age (Years)	-0.13* (0.04)	-0.19* (0.06)	
		Fuel Efficiency (Miles per Gallon)	+0.29* (0.06)	+0.31* (0.08)	
		Vehicle Type	Car	Referent	Referent
			Van	+2.15** (0.89)	
			SUV	+1.46** (0.59)	

\*, \*\*, and \*\*\* indicate significance at 99%, 95%, and 90% confidence levels, respectively. Standard errors appear in parentheses.

# Metropolitan Statistical Area-Level

Regression coefficient estimates for MSAs.

Level	Variable	Category	Distance (Miles)	Time (Minutes)
MSA	Y-Intercept		+10.69* (0.96)	+19.49* (1.48)
	Sprawl			
		Residential Density	+0.04* (0.01)	
		Degree of Centering	-0.03* (0.01)	-0.03** (0.01)
		Street Accessibility	-0.03** (0.01)	
	Subway			
	Yes			+3.71* (0.68)
	No		Referent	Referent

\* and \*\* indicate significance at 99% and 95%, confidence levels, respectively. Standard errors appear in parentheses.



# Conclusions

Contrary to Ewing et al. (2003) the effect of residential density on commute times was positive and significant.

The effect of centering is negative and significant.

Congestion did not have a significant effect on commute times or distances.

# Policy Implications

- Several measures of sprawl have a statistically significant effect on commuting outcomes, but the magnitudes of their effects are small.
- Mitigating congestion at the regional scale will not affect commuting outcomes.

# Acknowledgment

Thanks to Arjun Sheoran for help in gathering data for this study.