

## Adherence to Guidelines and its Effects on Hospitalizations with Complications of Type 2 Diabetes

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### ■ Abstract

**OBJECTIVES:** To study the discrepancy between actual and recommended rates of use among several measures of screening for complications of diabetes in a national longitudinal sample, the correlations among measures of adherence, and whether or not higher rates of adherence reduce hospitalizations for complications of diabetes. The key study hypothesis was that lack of adherence to professional recommendations for diabetes care leads to adverse health outcomes for elderly persons. **METHODS:** Administrative claims and survey data for 1994-1999 on a nationally representative sample of Medicare beneficiaries age 65+. Principal components analysis and instrumental variables probit regression methods were used. **RESULTS:** Most Medicare beneficiaries diagnosed with type 2 diabetes had at least one physician visit per year, but rates of screening (eye examina-

tions and HbA1c, lipid, microalbumin and urine tests) fell far short of recommendations. Correlations among use rates for various types of screening were positive but far less than one, suggesting that failure to screen reflects a complex set of underlying factors. Increased rates of adherence were observed for HbA1c and lipid testing over the observation period. Higher use was associated with lower rates of hospitalization for complications of diabetes (vascular ( $p=0.007$ ), renal ( $p=0.002$ ), and other complication ( $p=0.005$ )). **CONCLUSIONS:** Adherence to guidelines was associated with significantly reduced rates of hospitalization. Continued analysis of the trends in clinical practice is needed to demonstrate the effectiveness of standardized guidelines for the care of patients with diabetes.

**Keywords:** adherence · compliance · guidelines · diabetes mellitus · hospitalizations · complications

### Introduction

Diabetes mellitus is a major cause of mortality and morbidity among persons over age 65 in the United States [1, 2]. Given the benefits of control [3] and of therapeutic interventions to mitigate complications from the disease [4-6], various guidelines specify minimum rates of screening [7-9], and the Health Employer Data and Information Set (HEDIS) [10] uses conformance with certain recommendations for diabetes as a measure of quality of care. However, actual

screening rates fall far short of recommended levels [11-16]. The discrepancy plausibly reflects a combination of patient, physician, and system factors [17-19]. While such studies have been a cause for concern and have provided the basis for suggestions for methods to improve care, less well understood is the longitudinal pattern of care over many years. Because diabetes mellitus is a chronic disease, it is by understanding the patterns of longitudinal care, and then the impact of such care, that we can assess the value and import of regular care and how current care patterns either meet or fall short of appropriate levels.

This study used national administrative data from the Medicare program to address three issues. First, what is the discrepancy between actual and recommended rates of use among several measures of screening for complications of diabetes in a national longitudinal sample? Second, how correlated are the measures? Third, do higher rates of adherence to guidelines reduce hospitalizations for complications of diabetes? The key study hypothesis is that lack of adherence to professional recommendations for diabetes care leads to adverse health outcomes for elderly persons.

## Methods

The study population consisted of individuals 65 years and over at the time of entry into the study in the U.S. and who were enrolled in the National

Long-Term Care Survey (NLTC). The NLTC is a random sample of U.S. adults 65 years and older conducted by the U.S. Census Bureau and the Duke University Center for Demographic Studies. Because the NLTC was originally designed to study disability among elderly individuals, the sample included persons living in the community and in nursing homes.

The NLTC data files included individuals randomly selected from Medicare enrollment records who were 65 years or older at their first NLTC interview. More than 25,000 persons were surveyed in 1982 and 1984; the first survey years with follow-up interviews were conducted in 1989, 1994, and 1999. To maintain a consistent sample size of more than 20,000 subjects at each interview, new sample members were added at the 1989, 1994, and 1999 interviews. An oversample of 500-600 persons aged 95+ was added in 1994 and 1999.

**Table 1** Codes for Diagnosis and Procedures

Panel A: ICD-9-CM Diagnosis Codes for Complications	
Peripheral vascular disease (e.g. atherosclerosis, chronic ulcer of skin, gangrene and amputations)	440, 443, 444, 447.1, 451-454, 459, 707, 785.4, 885-887, 895-897
Neurological symptoms (e.g. occlusion of cerebral arteries, hemorrhagic stroke)	250.6, 337.1, 354, 355, 356.8, 357.2, 358.1, 430-438, 713.5, 729.2
Renal complications (e.g. proteinuria, renal failure and its sequelae)	250.4, 580-588, 590, 593, 595-597, 599.0, 791.0
Cardiovascular disease (e.g. myocardial infarction, heart failure)	250.7, 401-405, 410-414, 425-428, 429.1, 429.2, 429.3, 441-442, 458
Other Complications (e.g. bacteremia, infection, Coxsackie virus, other bone involvement, degenerative skin disorders)	079.2, 112.1, 112.3, 250.8, 250.9, 380.1, 558.9, 607.84, 681, 682, 709.3, 730.17, 731.8, 790.7
Panel B: CPT-4 and ICD-9-CM Procedure Codes for Diabetes Adherence Measures	
Physician visits	99201-99205, 99211-99215, 99241-99245, 99301-99303, 99311-99313, 99321-99323, 99331-99333, 99341-99345, 99347-99350, 99387, 99397, 99401-99404, 99411-99412, 99420-99429
HbA1c tests	83036
Lipid and cholesterol tests	80061, 82465, 83715, 83716, 83718, 83719, 83721, 84478
Urinalysis, microalbumin, proteinuria tests	82040, 82042, 882043, 82044, 84155, 81000, 81001, 81002, 81003
Eye examinations	92002, 92004, 92012, 92014, 92018, 92019, 92225, 92226, 92230, 92235, 92250, 92260, 16.21, 95.02, 95.03, 95.11, 95.12
Eye exams, with provider specialty code for optometrist or ophthalmologist	99024, 99025, 99201-99205, 99211-99215, 99241-99245, 99251-99255, 99261-99263, 99271-99275, 99281-99285
Eye exams, with any ocular complication	76511-76513, 76516, 67208, 67210, 67227, 67228
Eye exams, with any form of diabetic retinopathy	92287
Eye exams, with primary diagnosis of proliferative diabetic retinopathy	67036, 67038-67040, 67101, 67105, 67107-67110, 67112

We used the NLTCs to select the sample for our study and for identifying beneficiary links to Medicare administrative claims files. We limited our analysis of adherence to 1984-1999 for two reasons. Clinical recommendations on five tests and services were consistent during this period and 1991 was the first year that Medicare Part B (mainly physician) claims contained information on diagnoses. We used claims data from 1985 through 1993 to identify persons with a diagnosis of diabetes mellitus. Following a procedure used by others [20], a person was included in our analysis sample if diabetes was reported as a diagnosis on a single institutional claim (inpatient, skilled nursing facility, home health care, hospice, and outpatient) or at least two non-institutional claims (carrier/physician supplier/Part B, durable medical equipment, clinical labs).

We obtained the analysis samples through a series of steps. First, we restricted the analysis to individuals with type 2 diabetes and age 65+ at the start of 1994. This yielded a sample of 3,964. Next, measuring adherence to clinical recommendations for care required that we observe all individuals for a common length of time. In total, 1,469 of these persons died during 1994-1998, leaving 2,495 persons who survived. After eliminating individuals with invalid or missing data for key variables, we were left with 2,341 observations for the analysis of hospitalizations for diabetes complications.

The dependent variables were hospitalizations for the following complications of diabetes at least once during 1994-1998 - peripheral vascular, neurological, renal, cardiovascular, and other complications of diabetes (Table 1). Hospitalizations for endocrine complications were not assessed since only eight sample persons had such hospitalizations during 1994-1998.

The key explanatory variable in our analysis of the probability of hospitalization with each of the complications during 1994-1998 was an index of patient adherence to clinical recommendations. As a first step to constructing this index, we defined binary variables for whether or not during the year the person had had a physician visit, an HbA1c test, a dilated eye exam, a lipid test, and a urinalysis, which included microalbumin and proteinuria tests. All five measures were observable in the claims, and there were no major changes in coding practices during 1994-1998 for any of the five measures. Influenza vaccinations were observable in the claims data, but were excluded since the clinical practice recommendation changed during the period.

To develop an index of annual utilization of such visits and tests, we performed principal components analysis, selecting scores from the first principal component as the index. The main use of principal components and the related statistical technique of factor analysis is to reduce a large set of correlated variables into a smaller number of uncorrelated variables [21]. Both techniques have been applied to a wide range of fields, including medicine and the physical and social sciences [22]. With statistical software [23], one can easily compute linear transformations of a large set of variables to obtain a smaller set, or principal components, that retain most of the relationships and information in the original data. In this case, we began with five measures of adherence with clinical guidelines and retained a single variable, the first principal component. Analysis results using principal components and factor analysis were quite similar, so only the results for principal components are reported in this paper.

All dependent variables were binary (equal to one when a complication leading to a hospitalization was observed and zero otherwise); thus we used a form of probit analysis. Since the coefficients from probit regression do not reveal the effect of a change in the explanatory variable on the dependent variable, we computed marginal probabilities using Stata 8.0 [23], which gives a numerical derivative evaluated at the observational means.

The goal of our analysis was to assess the impact of adherence as measured by the index on hospitalizations for complications of diabetes. However, visits and testing may reflect severity of illness not recorded in administrative records and not accounted for by the other independent variables. To deal with potential endogeneity of the index (the possibility that the onset of complications influenced utilization of recommended care), we used an instrumental variables approach, Amemiya's generalized least squares (AGLS) [24], a form of probit analysis. This method requires that two conditions be satisfied. First, some variables must not have a direct effect on outcomes but affect utilization. (These variables only affect outcomes through their influence on utilization.) Second, the variables must be correlated with utilization [25]. Predictors of utilization that were omitted from the outcomes analysis were measures of the number of internal medicine and general practice physicians, ophthalmologists, and optometrists per 10,000 population in the person's Primary Sampling Unit (a standard metropolitan statistical area (SMSA) for residents of SMSAs and a county or small group of counties for others),

whether or not the person was enrolled in Medicaid, and whether or not the person had a private supplemental health insurance policy to Medicare.

We used two specification tests to check for the appropriateness and strength of the instrumental variables. To test the null hypothesis that the dependent variable is exogenous in which case the instrumental variable approach would be unnecessary, we used a test of exogeneity developed by Smith and Blundell [26]. We computed an F-test of the joint significance of the instruments in the first-stage regression to test that the instrumental variables were sufficiently correlated with the endogenous explanatory variable, the principal component of adherence. The results are shown in the appendix (Table A1 and A2).

Other explanatory variables in the analysis of hospitalizations were: the person's age in 1994; a binary variable for gender; whether the person had been diagnosed with dementia by the beginning of 1994; the person's DxCG score [27, 28], a measure of severity of illness based on diagnosis and procedure codes and demographic characteristics; the number of months the person was enrolled in a Medicare health maintenance organization (HMO) during 1994-1998; a prior history of the complication as of the beginning of 1994 (for the analysis of hospitalizations for complications); and several variables measuring the duration of diabetes. For persons for whom we likely observed the first diagnosis of diabetes, we included the number of years between 1994 and this first diagnosis (during 1984-1993). We included a separate explanatory variable for the number of years between diagnosis and 1994 for individuals for whom the first diagnosis of diabetes was censored. Our definition of censoring was observing a diabetes diagnosis in the first year of an individual's claims (beginning at age 65 or older) or a diabetes diagnosis in 1991 for individuals for whom we observed in claims prior to 1991. Therefore, our definition of "not censored" is individuals for whom we observed one or more years of claims without a diabetes diagnosis and who had a first diagnosis in 1984-1990 or 1992-1993. Physician (Part B) claims prior to 1991 lacked diagnosis codes, thus persons for whom we first observed a diagnosis of diabetes mellitus were probably diagnosed earlier. We also included dummy variables for whether the censoring occurred in the 1984-1990 period or the 1991-1993 period to account for differences in the diagnosis codes on the two types of claims.

## Results

On average, persons diagnosed with diabetes had 7.8 visits (median value 6.8); nearly all sample persons (89%) had at least one physician visit per year (Table 2). Annual utilization rates for the screening tests were much lower, ranging from 1.2 tests per year for urinalysis tests to 0.37 annually for lipid tests. Slightly more than half of the persons had eye exams per year (53%). However, less than a quarter of persons had lipid tests (22%). Rates of use of HbA1c tests and urinalysis were in between. Annual rates of HbA1c and lipid testing increased between 1994 and 1998, but even in 1998, only 40% of persons had an HbA1c test and only 33% had a lipid test in that year.

**Table 2** Diabetes Adherence Measures

**A. Number of services, 1994-1998**

Variables	Mean	SD	Median
General physician visits	7.84	5.93	6.80
HbA1c tests	0.68	0.96	0.20
Annual eye exam <sup>1</sup>	0.53	0.37	0.60
Lipid tests	0.37	0.65	0.20
Urinalysis tests	1.19	1.49	0.80

Variables	Mean values by year				
	1994	1995	1996	1997	1998
General physician visits	7.42	7.71	7.89	7.88	8.30
HbA1c tests	0.48	0.59	0.71	0.81	0.82
Annual eye exam <sup>1</sup>	0.52	0.54	0.53	0.53	0.52
Lipid tests	0.31	0.32	0.31	0.34	0.55
Urinalysis tests	1.18	1.23	1.18	1.16	1.18

**B. Rate of adherence (received service one or more times during year), 1994-1998**

Variables	Mean	SD	Median
General physician visits	0.89	0.25	1.00
HbA1c tests	0.33	0.35	0.20
Annual eye exam <sup>1</sup>	0.53	0.37	0.60
Lipid tests	0.22	0.28	0.20
Urinalysis tests	0.50	0.33	0.40

Variables	Mean values by year				
	1994	1995	1996	1997	1998
General physician visits	0.91	0.91	0.88	0.87	0.86
HbA1c tests	0.25	0.29	0.34	0.38	0.40
Annual eye exam <sup>1</sup>	0.52	0.54	0.53	0.53	0.52
Lipid tests	0.19	0.19	0.18	0.21	0.33
Urinalysis tests	0.50	0.51	0.51	0.48	0.49

<sup>1</sup> Annual eye exam is binary for one or more exams in both A and B.

**Table 3** Correlations among Diabetes Adherence Measures**A.** Mean number of services per year, 1994-1998

	General phys. visits	HbA1c tests	Annual eye exam	Lipid tests	Urinalysis tests
General physician visits	1.00				
HbA1c tests	0.15	1.00			
Annual eye exam	0.30	0.19	1.00		
Lipid tests	0.18	0.22	0.17	1.00	
Urinalysis tests	0.40	0.12	0.16	0.18	1.00

**B.** Rate of adherence (received service one or more times during year) averaged over 1994-1998

	General phys. visits	HbA1c tests	Annual eye exam	Lipid tests	Urinalysis tests
General physician visits	1.00				
HbA1c tests	0.24	1.00			
Annual eye exam	0.37	0.21	1.00		
Lipid tests	0.23	0.21	0.22	1.00	
Urinalysis tests	0.40	0.19	0.26	0.22	1.00

**C.** Mean number of services per year, 1994-1998, conditional on having had at least one physician visit in the year

	General phys. visits	HbA1c tests	Annual eye exam	Lipid tests	Urinalysis tests
General physician visits	1.00				
HbA1c tests	0.10	1.00			
Annual eye exam	0.22	0.15	1.00		
Lipid tests	0.14	0.20	0.14	1.00	
Urinalysis tests	0.37	0.09	0.12	0.16	1.00

**D.** Rate of adherence to those persons who had at least on physician visit in the year

	General phys. visits	HbA1c tests	Annual eye exam	Lipid tests	Urinalysis tests
General physician visits	1.00				
HbA1c tests	0.14	1.00			
Annual eye exam	0.22	0.16	1.00		
Lipid tests	0.15	0.18	0.17	1.00	
Urinalysis tests	0.25	0.13	0.17	0.18	1.00

Although the individuals visited physicians more than once every other month on average, mean numbers of tests were only weakly correlated with the mean numbers of visits (Table 3, Panel A). Correlations with the number of visits ranged from 0.40 for urinalysis to 0.15 for HbA1c tests, indicating that greater contact with a physician was only weakly associated with higher frequency of testing. Likewise the probability of receipt of tests was only weakly related to the probability of having at least one visit (Table 3, Panel B). In general, correlations among the five measures, although positive, were not higher than 0.26. Limiting the sample to persons who had at least one visit during the year did not alter the patterns observed for the entire sample (Panels C and D).

The first principal component accounted for 41% of the variance in the five utilization measures (Table 4). The values from the eigenvector indicated a high and positive association with each of the five measures. Each of the other four principal components was related to one or more of the other utilization measures (not shown) and individually, they explained much less of the variance in utilization than did the first principal component.

**Table 4** Principal Components Analysis of Diabetes Adherence Measures

Component	Eigenvalue	Difference	Proportion	Cumulative
1	2.035		0.407	0.407
2	0.869	1.167	0.174	0.581
3	0.791	0.078	0.158	0.739
4	0.741	0.050	0.148	0.887
5	0.565	0.176	0.113	1.000

First principal component retained for analysis:

Variable	Eigenvector
General physician visits	0.519
HbA1c tests	0.378
Annual eye exam1	0.463
Lipid tests	0.391
Urinalysis tests	0.469

We ranked the observations in order of their score on the first principal component and divided the sample into quartiles (Table 5). In the lowest quartile of scores, 61% of persons had at least one visit during the year. Annual rates of testing were all under 20%. Rates of use increased monotonically from the lowest to the highest quartile. In Quartile II, 96% of persons had visited a physician during the year on average, but rates

of adherence with the recommendations for testing remained quite low. In Quartile IV, almost 100% of patients had an annual physician visit, but rates of testing remained far below the recommended levels. Rates of testing ranged from 47% for lipid tests to 83% for annual eye exams.

**Table 5** Mean Values of Services by Quartile of Distribution of Principal Component Scores<sup>1</sup>

Quartile I ( range -3.847, -0.793)

	Mean	SD
General physician visits	0.601	0.354
HbA1c tests	0.110	0.193
Annual eye exam	0.189	0.240
Lipid tests	0.057	0.120
Urinalysis tests	0.194	0.216

Quartile II ( range -0.793, 0.147)

	Mean	SD
General physician visits	0.960	0.109
HbA1c tests	0.223	0.282
Annual eye exam	0.444	0.317
Lipid tests	0.122	0.187
Urinalysis tests	0.428	0.282

Quartile III ( range 0.147, 0.938)

	Mean	SD
General physician visits	0.987	0.054
HbA1c tests	0.360	0.328
Annual eye exam	0.661	0.316
Lipid tests	0.232	0.261
Urinalysis tests	0.584	0.291

Quartile IV ( range 0.938, 3.333)

	Mean	SD
General physician visits	0.998	0.023
HbA1c tests	0.633	0.353
Annual eye exam	0.826	0.236
Lipid tests	0.473	0.321
Urinalysis tests	0.776	0.234

<sup>1</sup> Mean is the proportion of years (1994-1998) with one or more service.

Rates of hospitalization during 1994-1998 for complications of diabetes ranged from 5.1% for non-cardiac vascular complications to 26.2% for cardiovascular complications (Table 6). These rates are for persons who survived through 1998. For persons who died between 1994 and 1998, hospitalization rates were appreciably higher, especially for renal (11.1% among decedents) and cardiovascular complications (36.0% among decedents, not shown in table).

**Table 6** Mean Values of Services<sup>1</sup>

	Mean	SD	No. of adverse outcomes
Hospitalized for vascular complications	0.051	0.220	119
Hospitalized for neurological complications	0.115	0.319	269
Hospitalized for renal complications	0.060	0.237	140
Hospitalized for cardiovascular complications	0.262	0.440	613
Hospitalized for other complications	0.053	0.225	125

<sup>1</sup> Sample size: N = 2341.

Adherence to guidelines was associated with lower rates of hospitalization for vascular ( $p=0.007$ ), renal ( $p=0.002$ ), and other complications of diabetes ( $p=0.005$ ) (Table 7) with hospitalization for cardiovascular complications being almost statistically significant at conventional levels ( $p=0.051$ ). Such hospitalizations were positively related to the number of years since diabetes had been diagnosed, whether the person had been hospitalized for the same complication before 1994 (1991-1993), and with comorbidities as measured by the DxCG score. These hospitalizations were negatively related to having a diagnosis of dementia (for some types of complications) and to the number of months the person had been enrolled in a Medicare HMO during 1994-1998. During the months the person was in an HMO, no utilization information was included in our data.

An increase in the adherence index from -0.5 to 0.5 (approximately a change from Quartile II to Quartile III) was associated with a reduction of 5.9% in the probability of being hospitalized for a vascular complication during 1994-1998. For hospitalizations for a renal complication, the reduction was 6.9% and cardiovascular and other, 9.5% and 5.9%, respectively.

## Conclusion

The vast majority of Medicare beneficiaries diagnosed with type 2 diabetes had at least one visit per year to a physician. However, rates of screening fell far short of recommendations. With the possible exception of eye examinations, screenings tend to be done at the physician's initiative. It is possible that the low screening rates demonstrated in this study represent physician responsiveness to immediate concerns that

**Table 7** Hospitalizations for Diabetes Complications, 1994-1998

Variable	Vascular	Neuro-logical	Renal	Cardio-vascular	Other
Adherence principal component	-0.635 <sup>a</sup> (0.235) [-0.059]	-0.223 (0.179) [-0.042]	-0.694 <sup>a</sup> (0.224) [-0.069]	-0.302 <sup>c</sup> (0.154) [-0.095]	-0.613 <sup>a</sup> (0.216) [-0.059]
Age	-0.020 <sup>b</sup> (0.012)	-0.007 (0.009)	-0.022 <sup>c</sup> (0.012)	-0.023 <sup>a</sup> (0.008)	-0.017 (0.011)
Male	0.086 (0.100)	0.047 (0.074)	-0.142 (0.105)	0.103 (0.063)	0.004 (0.099)
DM duration (not censored)	0.076 <sup>b</sup> (0.031)	0.045 <sup>c</sup> (0.024)	0.094 <sup>a</sup> (0.031)	0.055 <sup>a</sup> (0.020)	0.056 <sup>c</sup> (0.032)
DM duration (left censored)	0.050 (0.038)	0.068 <sup>b</sup> (0.029)	0.009 (0.037)	0.068 <sup>a</sup> (0.023)	0.031 (0.034)
Censored 1984-1990	0.220 (0.206)	0.078 (0.156)	0.459 <sup>b</sup> (0.209)	0.033 (0.128)	0.235 (0.202)
Censored 1991-1993	0.052 (0.314)	-0.231 (0.243)	0.334 (0.304)	0.007 (0.185)	0.344 (0.281)
Dementia	-0.302 (0.193)	-0.204 (0.152)	0.260 (0.168)	-0.405 <sup>a</sup> (0.130)	-0.469 <sup>b</sup> (0.203)
DxCG score	0.315 <sup>a</sup> (0.070)	0.245 <sup>a</sup> (0.054)	0.385 <sup>a</sup> (0.069)	0.489 <sup>a</sup> (0.053)	0.344 <sup>a</sup> (0.068)
Same complication diagnosed before 1994	0.492 <sup>a</sup> (0.112)	0.309 <sup>a</sup> (0.096)	0.537 <sup>a</sup> (0.117)	0.641 <sup>a</sup> (0.132)	0.329 <sup>a</sup> (0.113)
HMO months, 1994-1998	-0.039 <sup>a</sup> (0.015)	-0.019 (0.011)	-0.043 <sup>a</sup> (0.014)	-0.024 <sup>b</sup> (0.010)	-0.042 <sup>a</sup> (0.014)
Constant term	-0.774 <sup>c</sup> (0.885)	-1.128 <sup>c</sup> (0.654)	-0.748 (0.869)	-0.112 (0.563)	-0.969 (0.864)
Sample size	2341	2341	2341	2341	2341
Pseudo R-squared	0.060	0.038	0.104	0.075	0.059

Standard errors in parentheses. Marginal effects (effects of a one unit change in the first principal component on the probability of hospitalization for a complication) evaluated at sample means in brackets. <sup>a</sup> p < 0.01; <sup>b</sup> p < 0.05; <sup>c</sup> p < 0.10 (2 tailed test).

led to the visit rather than to health maintenance. The correlations among use rates for the various types of screening were positive but far less than one, suggesting that failure to screen reflects a complex set of underlying factors. The use rates were sufficiently correlated to yield a principal component that we interpreted as a general index of screening rates. Higher use, as indicated by higher values of the principal

component score, was associated with lower rates of hospitalization for complications of diabetes during this period.

Complications are prevalent in persons diagnosed with diabetes [29]. Both the Diabetes Control and Complications Trial (DCCT) in patients with type 1 diabetes [30] and the United Kingdom Prospective Diabetes Study (UKPDS) [31, 32] in patients with type 2 diabetes have demonstrated reductions in both the incidence and progression of microvascular complications with improved blood glucose control. In our study, although we lacked a patient-specific measure of glycemic control, we considered that increased monitoring may lead to effective therapeutic interventions, including improved lipid management, medications to prevent nephropathy, and retinal therapy. Further, accounting for the possibility that use may reflect unmeasured severity of illness, our analysis related several measures of screening to health outcomes.

## Discussion

Despite clear evidence that improved metabolic control has a positive impact on morbidity and mortality related to diabetes, adherence to recommended screening guidelines remains poor [7]. During the time period of this study (1994-1998), standards of medical care became more intensive. This may account for the increased rates of adherence seen for HbA1c and lipid testing, which have been particularly emphasized in recent years. However, adherence rates of 0.4 for HbA1c and 0.33 for lipid testing are still substandard. Of even greater concern are the low rates of adherence for screening measures less well emphasized to general physicians, such as urine testing and ophthalmologic exam. Additionally, the adherence rates seen for urine testing in this study are likely an overestimate since this variable includes codes for nine tests, whereas spot urine microalbumin testing is the recommended screening exam.

We acknowledge several limitations. First, we used administrative and survey data. Although such data offer several advantages, including being nationally representative of the U.S. population over age 65 and ability to track outcomes over time, detailed information on individual patients' clinical status is lacking. Some of the observed differences between recommended and actual care might have been explained with clinical information not available in administrative data sets [33]. We relied on diagnostic and procedure coding as supplied in bills from physicians and hospitals to Medicare for clinical information. Second, we

could not follow all types of screening specified in the guidelines, such as for foot care and neurosensory examination of the extremities. Such services were not billed separately from the physician visit; therefore we did not include these measures. We could not ascertain whether specific recommendations in the guidelines that reflect the specific clinical condition of the patient were followed. Third, we only followed persons diagnosed with type 2 diabetes for five years. The latency period for some complications of diabetes is considerably longer than this [34, 35]. Our adherence measure also required that we select individuals who survived for at least five years, so we did not capture the increased mortality associated with diabetes. Fourth, we lacked statistical power to follow some complications. Fifth, although we controlled for endogeneity of screening rates, our method relied on certain statistical assumptions which the method requires.

During the time of this study, a clear trend of improved adherence with screening recommendations

appears to have occurred with respect to HbA1c and lipid testing. Likewise, the data indicate that adherence to these guidelines was associated with reduced rates of hospitalization. This is in agreement with other data that indicate that increased vigilance for complications of diabetes reduces the morbidity associated with the disease. Although the methodology employed in this study allowed a comprehensive assessment of use of health maintenance parameters, these data did not extend beyond 2000. Continued analysis of the trends in clinical practice is necessary to demonstrate the effectiveness of standardized guidelines for the care of patients with diabetes.

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## ■ Appendix

**Table A1** Specification and Robustness Tests

	Vascular	Neurological	Renal	Cardiovascular	Other
Adherence principal component : AGLS coefficient	-0.635	-0.223	-0.694	-0.302	-0.613
SE <sup>1</sup>	(0.235)	(0.179)	(0.224)	(0.154)	(0.216)
Marginal effect <sup>2</sup>	[-0.059]	[-0.042]	[-0.069]	[-0.095]	[-0.059]
	p = 0.007	p = 0.214	p = 0.002	p = 0.051	p = 0.005
TSLS coefficient	-0.070	-0.047	-0.097	-0.091	-0.080
SE <sup>1</sup>	(0.025)	(0.034)	(0.026)	(0.047)	(0.025)
	p = 0.005	p = 0.168	p < 0.001	p = 0.053	p = 0.001
Smith-Blundell test of exogeneity					
Chi-squared (1 d.f.) <sup>3</sup>	8.711	1.244	14.026	6.779	11.537
	p = 0.003	p = 0.265	p < 0.001	p = 0.009	p < 0.001
F-test exclusion restrictions	6.240	6.240	6.240	6.240	6.240
	p < 0.001	p < 0.001	p < 0.001	p < 0.001	p < 0.001
	F(11,2320)	F(11,2320)	F(11,2320)	F(11,2320)	F(11,2320)
Sample size	2341	2341	2341	2341	2341

<sup>1</sup> SE = Standard error of estimate.

<sup>2</sup> See explanation in footnote to Table 7.

<sup>3</sup> d.f. = degrees of freedom.



**Table A2** First-Stage Regressions from TSLS Analysis

Variable	Vascular
Age	-0.028 (0.006)
Male	-0.075 (0.052)
DM duration (not censored)	0.051 (0.015)
DM duration (left censored)	0.041 (0.018)
Censored 1984-1990	0.261 (0.095)
Censored 1991-1993	0.021 (0.143)
Dementia	-0.262 (0.111)
DxCG score	0.246 (0.063)
Same complication diagnosed before 1994	0.204 (0.052)
HMO months, 1994-1998 <sup>2</sup>	-0.062 (0.002)
Optometrists (per 10,000) <sup>1</sup>	0.015 (0.011)
Ophthalmologists (per 10,000) <sup>1</sup>	0.041 (0.014)
Medicaid status	-0.191 (0.066)
Medigap <sup>1</sup>	-0.195 (0.077)
Rural <sup>1</sup>	-0.113 (0.080)
Predicted mortality	-1.026 (0.868)
Internal medicine and general practice MDs (per 10,000)	-0.003 (0.002)
Years of education	0.018 (0.009)
Constant term	1.745 (0.458)
Sample size	2341
R-squared	0.364

<sup>1</sup> Dummy variables for missing education, rural, optometrists and ophthalmologist not shown.

<sup>2</sup> HMO months is 1994-1999 for blindness and low vision and 1994-1998 for all other specifications.

Standard errors in parentheses. First-stage regressions for other runs are similar and are available upon request.

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