# Simulated Effects of Policies to Reduce Diabetes Risk Among Adults With Schizophrenia Receiving Antipsychotics

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**Objective:** Second-generation antipsychotics increase the risk of diabetes and other metabolic conditions among individuals with schizophrenia. Although metabolic testing is recommended to reduce this risk, low testing rates have prompted concerns about negative health consequences and downstream medical costs. This study simulated the effect of increasing metabolic testing rates on ten-year prevalence rates of prediabetes and diabetes (diabetes conditions) and their associated health care costs.

**Methods:** A microsimulation model (N=21,491 beneficiaries) with a ten-year time horizon was used to quantify the impacts of policies that increased annual testing rates in a Medicaid population with schizophrenia. Data sources included California Medicaid data, National Health and Nutrition Examination Survey data, and the literature. In the model, metabolic testing increased diagnosis of diabetes conditions and diagnosis prompted prescribers to switch patients to lower-risk antipsychotics. Key inputs included observed diagnoses, prescribing rates, annual testing rates, imputed rates of undiagnosed diabetes conditions, and literature-based estimates of policy effectiveness.

**Results:** Compared with 2009 annual testing rates, ten-year outcomes for policies that achieved universal testing reduced exposure to higher-risk antipsychotics by 14%, time to diabetes diagnosis by 57%, and diabetes prevalence by .6%. These policies were associated with higher spending because of testing and earlier treatment.

**Conclusions:** The model showed that policies promoting metabolic testing provided an effective approach to improve the safety of second-generation antipsychotic prescribing in a Medicaid population with schizophrenia; however, the policies led to additional costs at ten years. Simulation studies are a useful source of information on the potential impacts of these policies.

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The rising rates of dyslipidemia, type 2 diabetes, cardiovascular disease, and other metabolic conditions in the United States constitute a major public health crisis requiring a robust and effective multistakeholder response (1,2). The risk of developing these metabolic conditions is higher for people with schizophrenia (3,4), and antipsychotic drugs, the mainstay of schizophrenia care, contribute to this excess risk. The strength of the evidence for the association between second-generation antipsychotics, the most widely used class of antipsychotics, and metabolic risk varies substantially by drug (5–12). However, the high metabolic risk associated with several of these drugs is incontrovertible (13–16).

Although several professional societies have called for the routine assessment of glucose and lipid blood levels and other indicators of metabolic health to guide prescribing of second-generation antipsychotics (17,18), antipsychotictreated Medicaid populations are infrequently tested for metabolic abnormalities (19–21).

Because Medicaid is the most common payer for the treatment of nonelderly adults with schizophrenia (22), state Medicaid programs have a strong incentive to improve the safety of antipsychotic prescribing for this population. Although metabolic testing generates upfront costs associated with testing and treatment of conditions thus detected, metabolic testing may reduce this preventable morbidity and also reduce long-term health care costs. Therefore, efforts to increase testing rates may have important health and economic impacts.

Medicaid programs and the managed care organizations with which they contract may adopt a variety of policies (for example, pay for performance [P4P]) and other strategies (for example, academic detailing) to increase testing rates among beneficiaries with schizophrenia. Decision makers weighing whether to adopt any such policies often have incomplete information on policy benefits and costs. Simulation models can assist with policy design and implementation by providing preliminary information on the likely impacts of policies.

We conducted a microsimulation study to provide Medicaid policy makers and other stakeholders with information on the potential effects of policies aimed at increasing metabolic testing rates among beneficiaries with schizophrenia receiving antipsychotics. Our outcomes were ten-year prevalence rates of diabetes and prediabetes, a diagnosable precursor of diabetes, and their associated health care costs. We focused on diabetes because of its high public health significance.

#### METHODS

#### **Data Sources and Study Population**

We used California Medicaid Analytic eXtract data for calendar years 2002-2009. California has the largest and one of the most diverse Medicaid populations, an important consideration because diabetes risk varies by race-ethnicity. We identified fee-for-service, non-dual-eligible, continuously enrolled Medicaid beneficiaries with schizophrenia diagnoses (ICD-9 codes 295.xx) recorded in two or more outpatient claims (primary or secondary) or one or more inpatient claims during a 12-month period and observed their antipsychotic prescription fills from the date of the first schizophrenia diagnosis claim through December 31, 2008 (to allow for 12 months of data through the end of 2009; N=61,469). We excluded beneficiaries ages 0-19 and over age 65 (N=2,266) and with race-ethnicity other than black, Latino, and white, because only these categories were available in our other data sources (N=10,221).

Beneficiaries meeting the above criteria (N=48,982) contributed one to seven person-years to a panel data set containing 12-month aggregated information on antipsychotic utilization (drug and its assigned metabolic risk), metabolic testing, diabetes conditions (a term hereafter used to refer to prediabetes and diabetes), and Medicaid spending. We used this panel data set to calculate several simulation model parameter estimates (for example, transition probabilities for diagnosed diabetes and prescription drug utilization and transition rates) as described below. [Additional details are included in an online supplement to this article.]

We defined beneficiaries from the panel data set with 2002 observations as the "simulation cohort" (N=21,491) and used these beneficiaries and their 2002 demographic data and initial antipsychotic prescribing and diabetes conditions as the baseline for the microsimulation.

We assigned each person-year to one of three metabolic risk groups: high if we observed more than a 90-day cumulative supply of clozapine, olanzapine, or a low-potency first-generation antipsychotic (for example, chlorpromazine); medium if we observed more than a 90-day cumulative

supply of risperidone, quetiapine, or a medium-potency first-generation antipsychotic (for example, perphenazine); and low if we observed fewer than a 90-day cumulative supply of the aforementioned antipsychotics or more than a 90-day supply of aripiprazole, ziprasidone, or a highpotency first-generation antipsychotic (for example, haloperidol) in the one-year period. Drugs were classified on the basis of the literature (for example, 13–16) and the expertise of a member of our research team (JN) to classify drugs. Because there is insufficient evidence about the impact of antipsychotic combinations on metabolic risk (for example, whether risks are additive), polypharmacy regimens were assigned the risk of the highest-risk drug in the combination. We calculated exposure with the fill date and days supplied variables. We operationalized metabolic testing as receipt of at least one lipid test and at least one glucose test during a 12-month period [see online supplement for the Current Procedural Terminology codes]. Testing rates were calculated separately for individuals with and without a diabetes diagnosis.

As in other claims-based research (20), we identified beneficiaries with diagnosed diabetes as those with one or more inpatient or two outpatient claims with a diagnosis of diabetes or complications (ICD-9 codes 250, 357.2, 362.0, and 366.41). Claims-based diabetes diagnoses may be an underestimate of actual prevalence because of underdocumentation of diagnosed prediabetes or underdetection of both conditions. We overcame this limitation by using information on diagnosed prediabetes and undiagnosed diabetes conditions for black, Latino, or white individuals ages 20-64 available in the National Health and Nutrition Examination Survey (NHANES) data from 2007 to 2010. Because persons with schizophrenia may differ from the general population regarding both the risk of diabetes and its demographic distribution, we adjusted NHANES estimates with factors derived from the Clinical Antipsychotic Trials of Intervention Effectiveness (CATIE) (11,23) [see online supplement for details].

The study was approved by the RAND Institutional Review Board.

### Simulation Model

We developed a microsimulation model of prescriber decision making and disease progression over a ten-year horizon. In each iteration of the model, we simulated ten annual periods starting in 2002 through 2012 for the simulation cohort.

*Model inputs.* Our inputs included demographic characteristics (age; sex; and white, black, or Latino race-ethnicity), rates of undiagnosed and diagnosed diabetes conditions, rates of incident diabetes conditions, antipsychotic exposure over time in the three risk categories, prior metabolic testing, prescriber decision parameters (that is, how prescribers interpret and respond to test results), and policy effectiveness. Only demographic variables, initial antipsychotic risk

## FIGURE 1. Five health states of Medicaid beneficiaries in the simulation $\mathsf{model}^\mathsf{a}$



<sup>a</sup> Label A, transitions between health states without diagnosis; label B, transition from undiagnosed to diagnosed states; label C, transition between prediabetes and diabetes states conditional on diagnosis. Arrows indicate that individuals can remain in the state across simulation periods (curved) or transition to other states (straight)

category, and initial rates of undiagnosed and diagnosed diabetes conditions were assessed at baseline. [Detailed descriptions of each simulation parameter are included in the online supplement.]

Because policy effectiveness varies widely depending on context (for example, type of delivery system) and program design (for example, size of incentive payments) (24,25), we let it vary from 0%, or status quo testing rates (that is, observed testing rates in the Medicaid data), to 100%, a universal-testing scenario in which every eligible patient is tested annually. Because a 20% improvement in testing rates is feasible with modest policies (for example, with P4P programs incentivizing screening [26]), the model allowed for 20% increments from the status quo to the universal-

## FIGURE 2. Structure of the simulation model of effects of policies to reduce diabetes risk among adults with schizophrenia receiving antipsychotics<sup>a</sup>



<sup>a</sup> Data sources for initial conditions: MAX, California Medicaid Analytic eXtract, NHANES, National Health and Nutrition Examination Survey

testing scenario. Readers must judge whether larger impacts are feasible in their specific context.

*Model outcomes.* Our outcomes included metabolic testing rates (the proportion of years during which individuals received metabolic testing); rate of diabetes conditions diagnosed at the end of the study's ten annual simulation periods (the proportion of diagnosed individuals relative to all individuals with diabetes conditions); years with diabetes conditions (a count of person-years with diabetes conditions regardless of diagnosis status); time to diagnosis (years from onset to diagnosis for individuals with incident diabetes conditions); and short-term costs (costs of person-level testing, and other health care costs over the ten-year period), discounted to the baseline year (2002) [see online supplement for details].

### Simulation Model Framework and Evaluation

In each of the ten annual simulation periods, individuals were in one of five states: healthy (no diabetes conditions), undiagnosed prediabetes, diagnosed prediabetes, undiagnosed diabetes, or diagnosed diabetes (Figure 1). The microsimulation allowed for individuals to transition to other undiagnosed health states as described in Figure 1 but did not allow anyone to die or leave Medicaid.

We developed a set of assumptions for model inputs with insufficient empirical evidence. First, medium- and high-risk antipsychotics increase the risk of transitioning to diabetes condition states (that is, developing diabetes conditions) (27). Second, testing rates do not depend on the antipsy-

chotic prescribed. Third, test results reveal all diabetes conditions to the prescriber without error (that is, testing causes individuals to transition from undiagnosed to diagnosed states) (Figure 1, label B). Fourth and last, test results revealing diabetes conditions lead prescribers to switch patients on medium- and high-risk drugs to a lower-risk drug 100% of the time. Although prescribers may prefer to implement an adjunctive intervention, such as metformin, over switching antipsychotics, our third assumption is supported by empirical evidence that had just began to emerge (28,29) when the most recent Schizophrenia Patient Outcomes Research Team treatment recommendations were issued (30). Two randomized controlled trials (31,32) and two reanalyses of data from the CATIE study (33,34) have provided additional supporting evidence. This evidence indicates that although a switch from higherto lower-risk antipsychotics improves metabolic indices, a significant loss of clinical benefit is unlikely unless the drug is clozapine, thus suggesting that a switch to lowerrisk drugs should be considered a first-line

## TABLE 1. Estimates for each input in a simulation model of effects of policies to reduce diabetes risk among adults with schizophrenia receiving antipsychotics

Parameter	Estimate	Source <sup>a</sup>
Baseline annual metabolic testing rate	39.4%	Medicaid claims
Baseline diagnosed diabetes rate	Varies by age, sex, and race-ethnicity, mean=15.3%	Medicaid claims
Baseline undiagnosed diabetes rate	Varies by age, sex, and race-ethnicity, mean=5.6%	NHANES
Baseline diagnosed prediabetes rate	Varies by age, sex, and race-ethnicity, mean=5.2%	NHANES
Baseline undiagnosed prediabetes rate	Varies by age, sex, and race-ethnicity, mean=9.6%	NHANES
Healthy-to-prediabetes progression rate	Varies by age, sex, and race-ethnicity	NHANES
Prediabetes-to-diabetes progression rate	Varies by age, sex, and race-ethnicity	Medicaid claims
Disease progression risk multiplier for individuals on a low-risk antipsychotic compared with no antipsychotic	2×	Meyer et al., 2008 (27)
Disease progression risk multiplier for individuals on a high-risk antipsychotic compared with a low-risk antipsychotic	2×	Meyer et al., 2008 (27)
Probability of prescriber reading and accurately interpreting metabolic testing when performed	90%	Assumption, varied in sensitivity analysis
Probability of switch from high- to low- risk antipsychotic on testing and diagnosis	90%	Assumption, varied in sensitivity analysis
Annual Medicaid spending per year	Varies by age, sex, race-ethnicity, and diabetes diagnosis, mean±SD= \$13,287± \$16,905	Medicaid claims
Discount rate	5%	Assumption, varied in sensitivity analysis
Policy effectiveness	Varies	Range from 0% to 100% effectiveness measured by the proportion of residual, untested individuals who become tested as a result of the policy

<sup>a</sup> NHANES, National Health and Nutrition Examination Survey

strategy for patients who experience metabolic effects while taking nonclozapine antipsychotics. The risk-benefit analysis differs for clozapine, an underused drug in the United States (35), given its unrivaled effectiveness for treatmentresistant and suicidal presentations (30).

Figure 2 presents a graphical representation of our model. We evaluated the simulation model in Stata 13. For our main results, we evaluated the model 1,000 times for each 20% increment in policy effectiveness.

## RESULTS

## **Simulation Input Estimates**

The simulation cohort included 21,491 beneficiaries with a mean $\pm$ SD age of 43.3 $\pm$ 10.8 years. Of the 21,491 beneficiaries, 56.3% (N=12,110) were male, 28.8% (N=4,900) were black, and 16.7% (N=3,589) were Latino. Table 1 summarizes estimates for each simulation input, which are described in greater detail below.

*Prior diagnosed and undiagnosed diabetes conditions.* Table 2 presents data on the distribution of individuals at baseline

across the five simulation states. After imputing rates of undiagnosed and diagnosed diabetes conditions stratified by NHANES data for age, sex, and race-ethnicity, we found that 6.1% of individuals (N=1,303) in the simulation cohort had undiagnosed diabetes and 7.4% (N=1,597) had undiagnosed prediabetes in the baseline year. Older age, male sex, and black and Latino race-ethnicity were associated with higher rates of undiagnosed prediabetes and diabetes (all p<.001) (data not shown).

*Prior metabolic testing*. Overall, 39% of individuals (N=8,476) in the simulation cohort received metabolic testing in the baseline year. Testing was more likely for individuals with diagnosed versus undiagnosed diabetes (66% versus 34%, respectively, p<.001). Older age, female sex, and Latino ethnicity were associated with higher testing rates (all p<.001) (data not shown).

### **Simulation Outcomes**

Table 3 presents data on mean outcomes for the simulation cohort across 1,000 iterations from six policy effectiveness scenarios ranging from the status quo to universal testing. All

TABLE 2.	Baseline characteristics of 21,491 Medicaid beneficiaries in five health
states, by	level of antipsychotic risk

Antipsychotic risk and health state <sup>a</sup>	Percentage of simulation cohort overall <sup>b</sup>	Percentage of simulation cohort in risk category <sup>b</sup>	Source <sup>c</sup>
Low-risk antipsychotic	60.3	100.0	Medicaid
Healthy	38.2	63.3	d
Prediabetes, diagnosed	4.6	7.6	NHANES <sup>e</sup>
Prediabetes, undiagnosed	4.6	7.6	NHANES
Diabetes, diagnosed	9.3	15.4	Medicaid
Diabetes, undiagnosed	3.6	6.0	NHANES
High-risk antipsychotic	39.8	100.0	Medicaid
Healthy	25.6	64.5	<sup>d</sup>
Prediabetes, diagnosed	2.8	7.1	NHANES <sup>e</sup>
Prediabetes, undiagnosed	2.8	7.1	NHANES
Diabetes, diagnosed	6.0	15.1	Medicaid
Diabetes, undiagnosed	2.4	6.2	NHANES
Total	100	_	Medicaid

<sup>a</sup> Assignment to low- and high-risk antipsychotic categories was based on Medicaid prescription claims.

<sup>b</sup> Percentages may not sum to 100% because of rounding.

<sup>c</sup> NHANES, National Health and Nutrition Examination Survey

<sup>d</sup> Total cohort minus Medicaid diagnosed and NHANES undiagnosed populations

 $^{\rm e}$  We assumed that half of individuals with prediabetes (from <code>NHANES</code>) were diagnosed.

results were assessed at the end of the ten-year simulation time frame.

*Receipt of metabolic testing.* Individuals had on average 4.5 years with testing in the status quo and ten years with universal testing (a 120.3% increase).

*High-risk antipsychotic use.* High-risk antipsychotic use decreased as prescribers switched patients to lower-risk antipsychotics. High-risk antipsychotic use decreased from 5.4 years on average in the status quo to 4.6 years on average with universal testing (a 14.3% reduction).

*Years with undiagnosed diabetes conditions.* Individuals having at least one period with undiagnosed diabetes require testing to transition into the diagnosed diabetes state. The speed of this transition—and the initiation of diabetes treatment—depends on testing rates. In the model, individuals with diabetes remained undiagnosed for an average of 2.6 years in the status quo, compared with 1.1 years with universal testing. For individuals with prediabetes, the respective figures are 2.1 and 3.0 years. These trends reflect increased switching to lower-risk antipsychotics that resulted from more testing.

*Fraction of diabetes conditions that remained undiagnosed.* In the status quo, 2.4% of individuals with diabetes remained undiagnosed by the tenth year. As testing increased, the fraction of undiagnosed diabetes cases decreased to .1%. The fraction of undiagnosed prediabetes cases decreased from 16.8% (status quo) to 1.1% (universal testing).

*Diabetes prevalence.* There was a .6% decrease in the prevalence of diabetes by the tenth year as testing increased from the status quo to universal testing. Prediabetes rates were stable across all scenarios. This was expected because prescribers switch to lowerrisk antipsychotics only after a diabetes condition has been diagnosed.

*Ten-year testing and other costs.* Mean per-capita Medicaid spending ranged from \$83,896 in the status quo to \$84,681 with universal testing. Policy scenarios of greater effectiveness contributed to higher short-term Medicaid spending largely through earlier treatment-related spending on newly diagnosed diabetes. Although overall spending was on average \$712 higher with universal testing compared with the status quo, the difference in testing-related spending was only \$73.

## Simulation Sensitivity Analyses

*Prescriber switching behavior.* To account for the possibility that even when confronted with new diabetes conditions, prescribers may not switch to lower-risk drugs because of

clinical considerations (for example, intolerance and clinical need for clozapine) or patient preference, we varied switch rates (data not shown). With a 50% switch rate, a higher-risk drug was received for 20% of patient-years, compared with 18% under the always-switch assumption, leading to a small (<.1%) increase in the average years spent in undiagnosed states.

*Policy implementation and incentive costs.* Implementation of policies to increase testing rates could—depending on the intervention and design—entail additional costs. By way of example, we modeled the costs associated with P4P and assumed a supplemental \$100 incentive payment per-patient-per-year for tested patients to calculate per-capita Medicaid spending consistent with a P4P policy (data not shown). With this additional cost, per-capita spending was \$694 higher on average in the universal-testing scenario.

Antipsychotic risk levels. The benefits from testing decrease if medium- and high-risk antipsychotics pose less metabolic risk than in our base case. Reducing the excess risk by 50% slightly reduced the proportion of the population with diabetes conditions at the end of the ten-year simulation (51.9% versus 50.2%) (data not shown). Beneficiaries had an average of 2.4% more years with exposure to high-risk antipsychotics and were 3.9% less likely to switch to lower-risk drugs because of a diagnosed diabetes condition.

## DISCUSSION AND CONCLUSIONS

Using a microsimulation model, we found that hypothetical policies to incentivize metabolic testing have the potential to accelerate the diagnosis and reduce the prevalence of diabetes over a ten-year time horizon. This is an important finding because diabetes, a highly prevalent chronic illness, is associated with cardiovascular complications, disability, premature mortality, and substantial health care costs (36). Although the size of the effect for some study outcomes was small—for example, a decrease of <1% in diabetes prevalence—even this small decrease may have important clinical and economic implications.

Policies that aim to reduce diabetes risk among antipsychotictreated adults with schizophrenia by increasing testing rates must weigh implementationand treatment-related costs relative to cost savings from preventing illness progression. We found that effective policies were associated with higher shortterm costs. However, payers, patients, and the larger society might be willing to make the investment given the potential for better health outcomes. Although not assessed by our study, some of these outcomes may be evident only over a longer time horizon. These include improved cardiovascular health, improved mental health from better physical health, and improved quality of life.

Our study framed hypothetical policies in general terms rather than by specifying a particular intervention and its costs. We intentionally described our results in terms of relative policy effectiveness to increase generalizability across different strategies and health care contexts. A range of policies and other strategies may be implemented to promote safe and highvalue care. These include quality improvement interventions, such as academic detailing and audit and feedback, value-based purchasing tools, value-based formulary management tools, and

ABLE 3. Outcomes of a simulation model of effects of policies to reduce diabetes risk among adults with schizophrenia receiving antipsychotics, by policy effectiveness<sup>a</sup> Policy effectiveness

	%0		20	%	40	%	603	~	80	%	100	%	δ (100% 
Outcome	Σ	SD	Σ	SD	Σ	SD	Σ	SD	٤	SD	٤	SD	0%) <sup>b</sup>
ears with metabolic testing 0-vear prevalence of diabetes	4.540	.011	5.630	.011	6.720	.011	7.820	.010	8.910	600 <sup>.</sup>	10.000	.006	120.3
Diagnosed	.367	.003	.370	.002	.372	.002	.372	.002	.373	.002	.373	.002	1.6
Undiagnosed	600.	<.001	.005	<.001	.003	<.001	.002	<.001	.001	<.001	<.001	<.001	-88.9
Total	.376	.002	.375	.002	.374	.002	.374	.002	.374	.002	.374	.002	9.–
0-year prevalence of prediabetes													
Diagnosed	.118	.003	.128	.004	.133	.003	.137	.003	.140	.004	.142	.004	20.3
Undiagnosed	.024	.001	.016	<.001	.010	<.001	.007	<.001	.004	<.001	.002	<.001	-91.7
Total	.143	.004	.143	.004	.144	.003	.143	.003	.144	.004	.144	.004	1.5
ears of undiagnosed diabetes (among	2.580	.050	2.050	.042	1.690	.035	1.440	.029	1.250	.027	1.106	.024	-57.1
those with undiagnosed diabetes)													
ears of undiagnosed prediabetes	2.078	.054	2.380	.054	2.610	.054	2.780	.054	2.920	.056	3.020	.054	45.3
(among those with undiagnosed													
prediabetes)		0								ĊĊ			1
			0.1.09 601100	UZU.	4.901 70101	020. 020 tá	4.020 404	UZU.	4./20 601 1.47	170.		TZU.	-14.0
0-year per capita Medicaid costs	\$85,890	\$1,U5/	\$84,100	\$1,004	\$84,245	\$1,029	\$84,404	\$1,U/1	780,047	\$1,041	\$84,681	\$1,064	יס
Change in mean per capita spending	\$0	Ι	\$15		\$29	I	\$44	I	\$59	I	\$73	I	
versus status quo (0%) for testing													
Change in mean per capita spending versus status quo (0%) for all other	\$0	I	\$189	I	\$319	I	\$464	I	\$592	I	\$712	I	
spending													
Values are percentages except where indicate	ed. The model	allowed fo	or 20% increm	ients from t	ne status quo	(0%) to the	universal-tes	ting scenario	o (100%). Val	ues are mea	ans across the	e simulation	cohort. For

testing over the ten-year period and Percentage change in outcomes between policies with 0% and 100% effectiveness. All differences in outcomes between the status quo (0%) and the universal-testing scenario (100%) were statistically significant ULL years with metabolic simulation conort had a mean  $\pm$  su of 4.540  $\pm$ . e the status quo assumption (0%), 000 simulation iterations. Each individual value is significantly different from 0 (p<0.001) testing), under example, for the first row (year with metabolic

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p<.001)

financial incentives (such as P4P). In this study, we focused on estimating the likely magnitude and direction of some of these impacts rather than on conducting a formal costeffectiveness analysis of individual strategies. However, future research should simulate the cost-effectiveness of specific strategies implemented in specific health care settings. In this respect, it is illustrative that cost-effectiveness studies of diabetes screening in the general population suggest that screening is cost-effective among at-risk subgroups for whom costs are offset by lower future treatment costs (37).

Although antipsychotics are a critical component of schizophrenia treatment, prescribers need to consider safety as well as "hidden" medium- and long-term costs of treatment. There is consensus on the importance of monitoring metabolic indices among patients prescribed antipsychotics, as recognized by the inclusion of a diabetes screening measure for antipsychotic-treated patients in the core set of adult quality measures for Medicaid populations (38). However, despite notable efforts (39), this practice remains underused and inconsistently incentivized in Medicaid (20,21).

Several factors contribute to the underuse of metabolic testing (20). The fragmentation of the delivery and payment systems for publicly financed care of serious mental illness probably plays a key role, because the benefits of preventive interventions as well as the costs of their underuse spread over different actors and over time.

This study had some limitations. First, we relied on imputed NHANES data for undiagnosed diabetes and prediabetes prevalence rates, adjusted in aggregate to better approximate the population with schizophrenia. Although these health states are critical to decision makers who weigh the costs and benefits of policy options, they are unavailable in claims data. We were able to match rates for these conditions with the simulation cohort by using the demographic information available in the Medicaid data (including age range, sex, and race-ethnicity but not body mass index). Second, our simulations required a number of assumptions in regard to testing rates, prescriber behavior, and other parameter estimates. However, we based all assumptions on empirical evidence augmented with expert opinion provided by a member of our team (JN). Moreover, our results were robust to different assumptions, as demonstrated by our sensitivity analyses. Third, our study cohort included beneficiaries from only a single state, and thus results may not be generalizable elsewhere. Fourth, we assumed that individuals do not transition toward healthier states, although this is possible if diagnosis of a diabetes condition results in lifestyle or other changes, as a result we may have underestimated benefits from screening. Finally, because prediabetes diagnoses are inconsistently recorded in claims, we focused only on the incremental costs associated with diabetes diagnoses. As a result, we likely underestimated the total costs associated with diabetes conditions.

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