Original Scholarship

The Role of Value-Based Payment in Promoting Innovation to Address Social Risks: A Cross-Sectional Study of Social Risk Screening by US Physicians

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Policy Points:

- One of the most important possibilities of value-based payment is its potential to spur innovation in upstream prevention, such as attention to social needs that lead to poor health. Screening patients for social risks such as housing instability and food insecurity represents an early step physician practices can take to address social needs.
- At present, adoption of social risk screening by physician practices is linked with having high innovation capacity and focusing on lowincome populations, but not exposure to value-based payment.
- Expanding social risk screening by physician practices may require standardization and technical assistance for practices that have less innovative capacity.

Context: One of the most important possibilities of value-based payment is its potential to spur innovation in upstream prevention, such as attention to social needs that lead to poor health. However, there is uncertainty about the conditions under which value-based payment will encourage health care providers to innovate to address upstream social risks.

Methods: We used the 2017-2018 National Survey of Healthcare Organizations and Systems (NSHOS), a nationally representative survey of physician practices (n = 2,178), to ascertain (1) the number of social risks for which

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practices systematically screen patients; (2) the extent of practices' participation in value-based payment models; and (3) measures of practices' capacity for innovation. We used multivariate regression models to examine predictors of social risk screening.

Findings: On average, physician practices systematically screened for 2.4 out of 7 (34%) social risks assessed by the survey. In the fully adjusted model, implementing social risk screening was not associated with the practices' overall exposure to value-based payment. Being in the top quartile on any of three innovation capacity scales, however, was associated with screening for 0.95 to 1.00 additional social risk (p < 0.001 for all three results) relative to the bottom quartile. In subanalysis examining specific payment models, participating in a Medicaid accountable care organization was associated with screening for 0.37 more social risks (p = 0.015). Expecting more exposure to accountable care in the future was associated with greater social risk screening, but the effect size was small compared with practices' capacity for innovation.

Conclusions: Our results indicate that implementation of social risk screening—an initial step in enhancing awareness of social needs in health care—is not associated with overall exposure to value-based payment for physician practices. Expanding social risk screening by physician practices may require standardized approaches and implementation assistance to reduce the level of innovative capacity required.

Keywords: social determinants of health, social risk screening, primary care, implementation science.

B MERGING EVIDENCE SUGGESTS THAT HELPING PATIENTS resolve social needs such as unstable housing, food insecurity, and lack of income can improve health and thereby reduce unnecessary health care use and spending.¹⁻³ Health care providers operating under value-based payment models such as capitated insurance designs, accountable care organizations (ACOs), and pay-for-performance programs, therefore, could have a business case for identifying patients' social risks and offering support to help patients address social needs.⁴ However, there is uncertainty about the conditions under which valuebased payment incentives will actually lead health care providers to innovate with upstream approaches focused on social needs of vulnerable populations.^{5,6} A recent evidence synthesis found a lack of research to determine which if any accountable care models were encouraging attention to social needs,⁷ though two studies have reported unadjusted associations between social needs programs and ACO participation.^{8,9} Upstream approaches stretch the traditional boundaries of health care, requiring new types of expertise and new work patterns for health care organizations. Further research is needed to understand how value-based payment models and organizational capacity for innovation jointly influence adoption of upstream approaches.

To help patients with upstream social needs, health care providers must first become aware of social risks faced by their patients.⁷ Although models for assisting patients with social needs in health care settings remain nascent, a 2019 consensus report by the National Academy of Medicine stated that "identifying social needs is a critical first step to the integration of these needs into health care."⁷ Screening patients for social risks is core to pilot initiatives such as the federal Accountable Health Communities model, in which participating health care providers use a standardized tool to screen Medicare and Medicaid patients for risks related to housing, food, transportation, utilities, and safety.¹⁰

Additional efforts to document social risks in health care settings have proliferated in recent years.^{11,12} Large-scale empirical evidence on implementation of social risk screening remains limited,⁷ but the recent National Survey of Healthcare Organizations and Systems (NSHOS) indicated that across the United States, less than one-quarter of either physician practices or hospitals systematically screen patients for common social risks.⁸ Descriptive results from this recent survey published by members of our team showed that physician practices participating in value-based payment models such as ACOs and bundled payments were more likely to screen for social risks.⁸ It is unclear, however, if these value-based models facilitate social care integration, or if underlying organizational capacities facilitate both value-based payment and social risk screening.

Dissemination of Health Care Delivery Innovations

Prominent conceptual models of innovation in health care recognize that some organizations are better at identifying and implementing care delivery innovations than other organizations, regardless of external incentives that may be created by value-based payment. Organizationlevel capacity to implement innovations—also called absorptive capacity¹³—often depends on having an organizational culture that encourages innovation, as well as specific infrastructure and skills needed to deploy the innovation in question. As an emergent intervention, social risk screening implementation may be especially sensitive to whether a particular physician practice has an organizational culture of innovation. Because social risk screening involves complex processes with many potential points of failure,¹⁴ implementation is also likely to depend on physician practices having certain prerequisite infrastructure and skills. Such prerequisites could include information technology to administer screening and having established processes for adapting care delivery systems within the practice.

In considering dissemination of social risk screening, it is also important to recognize that patients with unmet social needs are unevenly distributed across physician practices. Practices where low-income patients make up a substantial share of the patient population, such as Federally Qualified Health Centers (FQHCs), would likely see more advantages to introducing systematic approaches to social risk screening.

The recent availability of national data on social risk screening by physician practices presents an opportunity to investigate how valuebased payment encourages social risk screening across practices with varying capacities for innovation and levels of patient need. Value-based payment models continue to spread. One of the most important possibilities of value-based payment is its potential to spur innovation in upstream prevention, correcting a market failure that has historically focused innovators on curative as opposed to preventive interventions. Innovation in a system as complex as health care delivery depends on many factors, however, making it important to deepen our understanding of the interrelation of value-based payment and organizational capacities that underlie innovation.

In this study, we used detailed data on US primary care physician practices to examine how exposure to value-based payment models and practice capacity for innovation were associated with the extent to which physician practices screen for social risks. Our results can help inform practitioners and policymakers interested in the interaction between value-based payment and adoption of new models of prevention by health care providers.

Methods

Sample and Data Collection

We used the 2017-2018 National Survey of Healthcare Organizations and Systems to obtain data on screening for social risks, exposure to value-based payment reform, and organizational capacity for innovation. NSHOS is a nationally representative survey of physician practice sites that include three or more adult primary care physicians.¹⁵ The survey was completed by a practice leader on behalf of the practice. NSHOS used the OneKey database, produced by IQVIA, to identify physician practices and draw a representative national sample. A total of 2,333 of 4,976 physician practices completed the NSHOS survey (response rate 46.9%). After we removed 155 responses from practices that were identified as ineligible or missing variables needed for our analysis, survey responses from 2,178 practices were available for analysis.

Dependent Variable

The NSHOS survey asked practices to report whether they had systems in place to screen for seven social risks: food insecurity, housing instability, utility needs, interpersonal violence, transportation needs, inability to pay medical bills, and unused Medicaid eligibility. We calculated the number of social risks screened by each practice.

Independent Variables

Exposure to Value-Based Payment Models. We calculated current exposure as number of value-based payment initiatives the practice reported on the NSHOS (range 0-7). Options included bundled or episode-based payment, improvement programs such as the Comprehensive Primary Care initiative or patient-centered medical homes, pay for performance, capitated contracts, Medicare ACOs, Medicaid ACOs, and commercial ACOs. As a measure of expectations for future exposure, we used a single-item measure of the proportion of patients the respondent anticipated being covered by accountable care models in five years (responses dichotomized to None/Some and Most/All).

Practice Capacity for Innovation. We used NSHOS survey responses to generate four measures of practice capacity for innovation: (1) innovation

culture (5-item scale), (2) barriers to adopting care delivery innovations (6-item scale), (3) advanced data system capacity (7-item scale), and (4) whether the practice had a system in place to keep up with evidence (single item). Details of scales are provided in the online Appendix.

Focus of Practice on Low-Income Patient Population. To ascertain underlying social risk of practices' patient population we used NSHOS survey items indicating whether the practice was an FQHC or "FQHC lookalike" and the share of the practice's revenue from Medicaid, categorized as none, low (<30%), or high (30% or higher). We chose 30% as the threshold for high share of practice revenue from Medicaid as this cutoff has been used in prior studies that examine relationships between Medicaid revenue and adoption of care processes by physician practices.¹⁶

Covariates

Additional NSHOS survey items were obtained to measure other practice characteristics shown in prior work to influence adoption of different types of care delivery innovations, including practice ownership, practice size, and geographic region.¹⁷

Analysis

We began by generating descriptive statistics and examining unadjusted associations between dependent variables and independent variables. To facilitate interpretation, we converted scores on all scale-based independent variables to quartiles. Next, we used multivariable linear regression analysis to model associations among the number of social risks screened by a practice, exposure to value-based payment, and practices' capacity for innovation, adjusting for covariates. We used a successive-modelbuilding approach, beginning with a model including only the covariates, then adding measures of value-based payment exposure, and finally adding the measures of practices' capacity for innovation. We conducted two subanalyses to test the robustness of our findings to alternative specification of the dependent and independent variables. First, instead of operationalizing value-payment exposure as a continuous scale, we included dichotomous variables for each of the value-based payments together in a single model. Second, rather than modeling the dependent variable as the total number of social risks screened, we used logistic

regression analyses to model the odds of screening for each of the 7 social risks separately.

All models were weighted to reflect the national population of physician practices that have 3 or more primary care physicians. Weights adjust for the stratified sampling design of the NSHOS survey as well as practice characteristics associated with survey nonresponse. Stata 14 was used for all analyses.

Results

On average, physician practices reported systematically screening for 2.4 out of 7 (34%) social risks assessed by the survey. About 13% of practices screened for all 7 risks, while 23% of practices screened for none. In terms of key exposures, about 89% of practices reported participating in any type of value-based payment model. Pay for performance was the most commonly reported, with 65% of practices participating. Looking to the future, 43% of practices anticipated most or all revenue to come from accountable care in five years. Of practices in our sample, 14% were FQHCs and 22% derive a high share (>30%) of practice revenue from Medicaid. Nearly half of practices were owned by a hospital or health system. See additional characteristics in Table 1.

In analyses adjusted only for basic practice characteristics (ownership, size, and region) and underlying social risk of the patient population (FQHC status and Medicaid revenue), practices in the highest quartile of value-based payment participation screened for an additional 0.47 social risks (p = 0.017) compared with practices in the lowest quartile of value-based payment participation. Practices expecting most or all of their patients to be covered by accountable care models in the future screened for 0.46 more social risks (p = 0.001) than practices expecting some or none of their patients to be covered by such contracts. These results are shown in Table 2.

The association between current participation in value-based payment models and social risk screening was no longer significant after adding measures of practice capacity for innovation. The fully adjusted model revealed that all four of our measures of practice capacity for innovation were associated with social risk screening (results in Table 2 and Figure 1). Being in the top quartile on the three innovation capacity scales was associated with screening for 0.95 to 1.00 additional social

		Unwe	ighted
		Freq/ Mean	%/SD
Mean number social risks	s screened by practice	2.4	34.0
Practice is FQHC/look-al	ike	314	14.3
Medicaid revenue	None	288	13.2
	Low Medicaid (<30%)	1,423	65.0
	High Medicaid (≥30%)	479	21.9
Value-based payment ref		42.6	27.6
Payment reforms	Bundled payments	584	26.7
2	Improvement programs	1,227	56.0
	Pay for performance	1,426	65.1
	Capitated contracts	1,001	45.7
	Medicare ACO	1,100	50.2
	Medicaid ACO	750	34.3
	Commercial ACO	961	43.9
Anticipated accountable	None/Some	1,260	57.5
care in 5 years	Most/All	930	42.5
Innovation culture scale*	:	53.0	21.4
Innovation barriers scale	*	55.1	29.5
Advanced data systems s	cale*	54.5	21.5
System for evidence		981	44.8
Practice ownership	Hospital or system	1,158	52.9
I.	Larger physician group	267	12.2
	Independent	612	28.0
	Other	153	7.0
Practice size	0-3 physicians	539	24.6
	4-7 physicians	845	38.6
	8-12 physicians	331	15.1
	13-19 physicians	167	7.6
	20+ physicians	308	14.1
Region (census)	West	548	25.0
	Midwest	631	28.8
	Northeast	433	19.8
	South	578	26.4

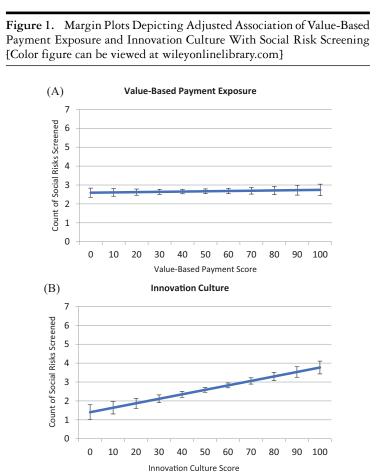
Abbreviations: ACO, accountable care organization; FQHC, Federally Qualified Health Center; SD, standard deviation.

Scale variables marked with an asterisk (*) are composite scales calculated from multiple survey items. In all cases, scale scores can range from 0 to 100.

		Model 1: Adjusted for Value-Based Pavment	Model 2: Also Adjusted for Practice Cabacity for
	Unadjusted (Bivariate) Associations	Exposure Only Coefficient	Innovation Coefficient
FQHC status			
Not FQHC	Ref	Ref	Ref
FQHC	1.66^{***}	1.28^{***}	1.08^{***}
Medicaid revenue			
None	Ref	Ref	Ref
Low	1.05^{***}	0.93^{***}	0.87^{***}
High	1.72^{***}	1.27^{***}	1.10^{***}
Payment reform index			
Quartile 1	Ref	Ref	Ref
Quartile 2	0.05	-0.07	-0.09
Quartile 3	0.34	0.25	0.12
Quartile 4	0.71^{***}	0.47*	0.16
Anticipated accountable			
care in 5 years			
None or Some	Ref	Ref	Ref
Most or All	0.57^{***}	0.46^{***}	0.40^{**}

Table 2. Continued			
	Unadjusted (Bivariate) Associations	Model 1: Adjusted for Value-Based Payment Exposure Only Coefficient	Model 2: Also Adjusted for Practice Capacity for Innovation Coefficient
Innovation culture			
Quartile 1	Ref		Ref
Quartile 2	0.67^{***}		0.42*
Quartile 3	1.15^{***}		0.64^{***}
Quartile 4	1.82^{***}		1.00^{***}
Innovation barriers			
Quartile 1	Ref		Ref
Quartile 2	-0.56^{**}		-0.3
Quartile 3	-1.04^{***}		-0.69^{***}
Quartile 4	-1.83^{***}		-0.98^{***}
System for evidence			
No	Ref		Ref
Yes	0.93***		0.47**
			Continued

Table 2. Continued			
		Model 1: Adjusted for Value-Based Payment	Model 2: Also Adjusted for Practice Capacity for
	Unadjusted (Bivariate) Associations	Exposure Unly Coefficient	Innovation Coefficient
Advanced data systems			
Quartile 1	Ref		Ref
Quartile 2	0.38*		0.18
Quartile 3	0.65^{**}		0.34^{*}
Quartile 4	1.58^{***}		0.95***
Observations	2,178	2,178	2,178
Abbreviation: FQHC, Federally Qualified Health Center. * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$. The dependent variable in all models is the number of s to 7, representing the total number of risks screened froi need for financial assistance with medical bills, and Medic ownership, practice size, and geographic region.	Abbreviation: FQHC, Federally Qualified Health Center. $p < 0.05$, $^{**}_{**} p < 0.01$, $^{***}_{**} p < 0.001$. The dependent variable in all models is the number of social risks systematically screened by the practice. The number of social risks can range from 0 To 7, representing the total number of risks screened from food insecurity, housing instability, utility needs, interpersonal violence, transportation needs, need for financial assistance with medical bills, and Medicaid eligibility. Other variables included in the adjusted model (but not shown here) were practice ownership, practice size, and geographic region.	ally screened by the practice. The nu using instability, utility needs, interp- variables included in the adjusted mo	mber of social risks can range from 0 ersonal violence, transportation needs, del (but not shown here) were practice



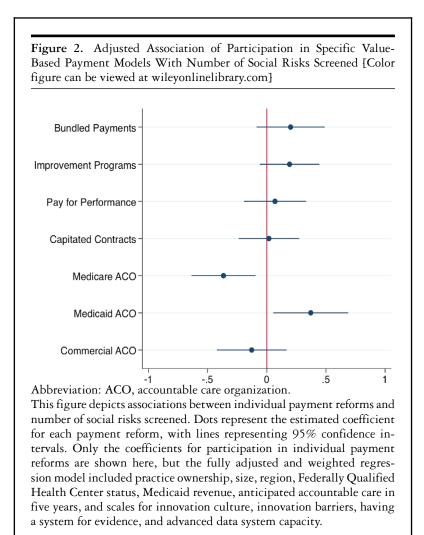
These panels, based on the multivariable analyses presented in Table 2, show adjusted relationships between the number of social needs screened by a physician practice and select variables of interest. Panel A illustrates the nonsignificant relationship between greater exposure to value-based payment models and social risk screening. Panel B illustrates the significant, positive association between practice scores on the innovation culture scale and social risk screening. Social risk screening also showed a significant, positive relationship with our other three measures of practice capacity for innovation as well, namely, scales measuring barriers to care delivery innovation and advanced health data system capacity, and the single-item measure of having a system in place to keep up with evidence.

risk ($\phi < 0.001$ for all three results) relative to the bottom quartile. Having a system in place to keep up with evidence was associated with screening for 0.47 additional social risks ($\phi = 0.001$). Although practices' current participation in value-based payment was not associated with social risk screening in the adjusted models, expectations about future payment were. Practices expecting most or all of their patients would be covered by contracts with total cost of care accountability in five years screened for 0.40 more social risks ($\phi = 0.002$) than practices expecting some or none of their patients to be covered by such contracts.

We examined individual payment models in subanalyses in order to see whether our scale of exposure to value-based payment might have obscured differences among specific payment models. Participating in a Medicaid ACO was associated with screening for 0.37 more social risks (p = 0.015). No other payment models were associated with increased screening, although participating in a Medicare ACO was associated with screening for fewer social risks (Figure 2 and Table A2 in the online Appendix). In our subanalyses that examined screening for each of the 7 social risks in separate logistic regression models-rather than the total number of risks included in social screening-current participation in value-based payment models was not associated with increased screening for any of the individual social risks (Table A3 in the online Appendix). Anticipating most or all revenue from accountable care in the future was associated with greater odds of screening for food insecurity, housing instability, utility needs, and interpersonal violence. With just a few exceptions, almost all measures of higher practice capacity for innovation were associated with greater likelihood of screening for each individual social risk.

Discussion

Health care stakeholders—including academics and health policy thought leaders—have expressed optimism that the spread of valuebased payment models will encourage providers to consider approaches to improve health outcomes through attention to social dimensions of health.^{4,18} Our results indicate that implementation of social risk screening—an initial step in enhancing awareness of social needs—is not associated with overall exposure to value-based payment for physician practices. Instead, social risk screening is being implemented by



practices with high capacity for innovation and in practices serving patient populations likely to face social risks, regardless of payment incentives. We do find that expectations about future exposure to accountable care may play a role in practice decisions to implement social risk screening, but the magnitude of this association is considerably lower than the association with innovative capacity. Examining the role of specific payment reforms in subanalyses supported the interpretation that practice capacity for innovation, rather than payment incentives, is the primary driver of social risk screening. The only value-based payment mechanism associated with increased screening was participation in a Medicaid ACO. That association may stem from some state Medicaid programs' explicit requirements¹⁹ as opposed to cost-of-care incentives. Participation in a Medicare ACO was associated with reduced social risk screening.

The lack of association with value-based payment exposure at this stage—and dependence on organizational innovation capacity—has important implications for efforts to leverage social care to improve health. First, physician practices currently participating in more value-based payment programs are not more likely to screen for social risks once capacity for innovation is considered. In other words, incentives in today's value-based payment models do not generally appear sufficient to encourage practices to initiate the screening activities that are typically a first step toward addressing health-related social needs.

Second, standardized approaches and implementation assistance may be needed to lower the bar on innovative capacity required to introduce social risk screening at the practice level. Experiences in Oregon, which introduced Medicaid flexibility to spend on social determinants of health in 2012, suggest that too much flexibility around initiatives to address social needs can be paralyzing. In the face of uncertainty about what types of social services were considered health-related, some coordinated care organizations did not fully use the new spending flexibility, leading the state to introduce more specific definitions of health-related services in 2017.²⁰

Third, individual physician practices may not be in a position to independently adopt social risk screening given the association between screening and advanced electronic health records and data systems. Affiliation with larger health systems may be important to help practices access emerging electronic health record-based tools for social risk screening.

Fourth, physician practices seeking to optimize performance under value-based payment may be waiting for further evidence to decide whether screening patients for social risks and intervening to support social needs represents a strategy for success under these payment models. The most recent intervention studies on this topic have shown mixed results depending on the intervention and targeting strategies.^{3,21-23} Larger managed care organizations and integrated health systems have the scale and analytic capacity to pilot and evaluate the impact of social needs assistance strategies internally, but individual physician practices rarely do. Thus, accumulation of further published evidence regarding impacts of interventions to address social needs is likely to be particularly important to inform adoption decisions among physician practices.

Limitations

Our results should be interpreted in light of study limitations. First, our analysis represents cross-sectional associations and therefore cannot be used to infer causality. However, we adjust for many potential confounding variables and believe that our results make a valuable contribution in an area where evidence is lacking. Second, survey nonresponse could influence generalizability of our findings, although we were able to mitigate this impact by using nonresponse weights. Third, reliance of the NSHOS on a single survey respondent to represent each practice could introduce misclassification bias, particularly for measures of innovation capacity, which rely on some personal judgment. Such challenges to reliability would likely bias results toward the null, however, suggesting that the highly significant associations involving these measures in our analyses are more likely to underestimate the relationship between innovation capacity and implementation of social risk screening.

Future Directions

In considering the design of future value-based payment incentives, it is also important to address the potential for divergent impacts on practices where low-income patients are concentrated versus practices serving a broader range of income groups. Investing in systems for social risk screening could benefit FQHCs and other practices primarily serving lower-income patients, and our results do show that such practices are implementing more social risk screening. At the same time, practices not primarily serving low-income patients may decline to invest in developing these types of supports, leading to greater differentiation in the ability of practices to identify and respond to health-related social needs. In summary, our results add to the small but growing evidence base characterizing the adoption of social care strategies in the US health care system. These findings build on earlier results documenting a relatively low prevalence of social risk screening among US physician practices and explore how value-based payment and practice capacity for innovation appear to influence patterns of adoption. Monitoring organizational efforts to address patients' social needs can shed light on how value-based payment reforms influence adoption. This may also elevate other tools, such as support for practice innovation, that are necessary to improve health care for patients with unmet social needs.

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Supplementary Material

Additional supporting information may be found in the online version of this article at http://onlinelibrary.wiley.com/journal/10.1111/ (ISSN)1468-0009:

Online Technical Appendix